

# Interactions among Biodiversity and Socioeconomics in the Greater Yellowstone Ecosystem

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**Funded by: NASA, USDA-NRI, USFS, MFWP, USFWS**

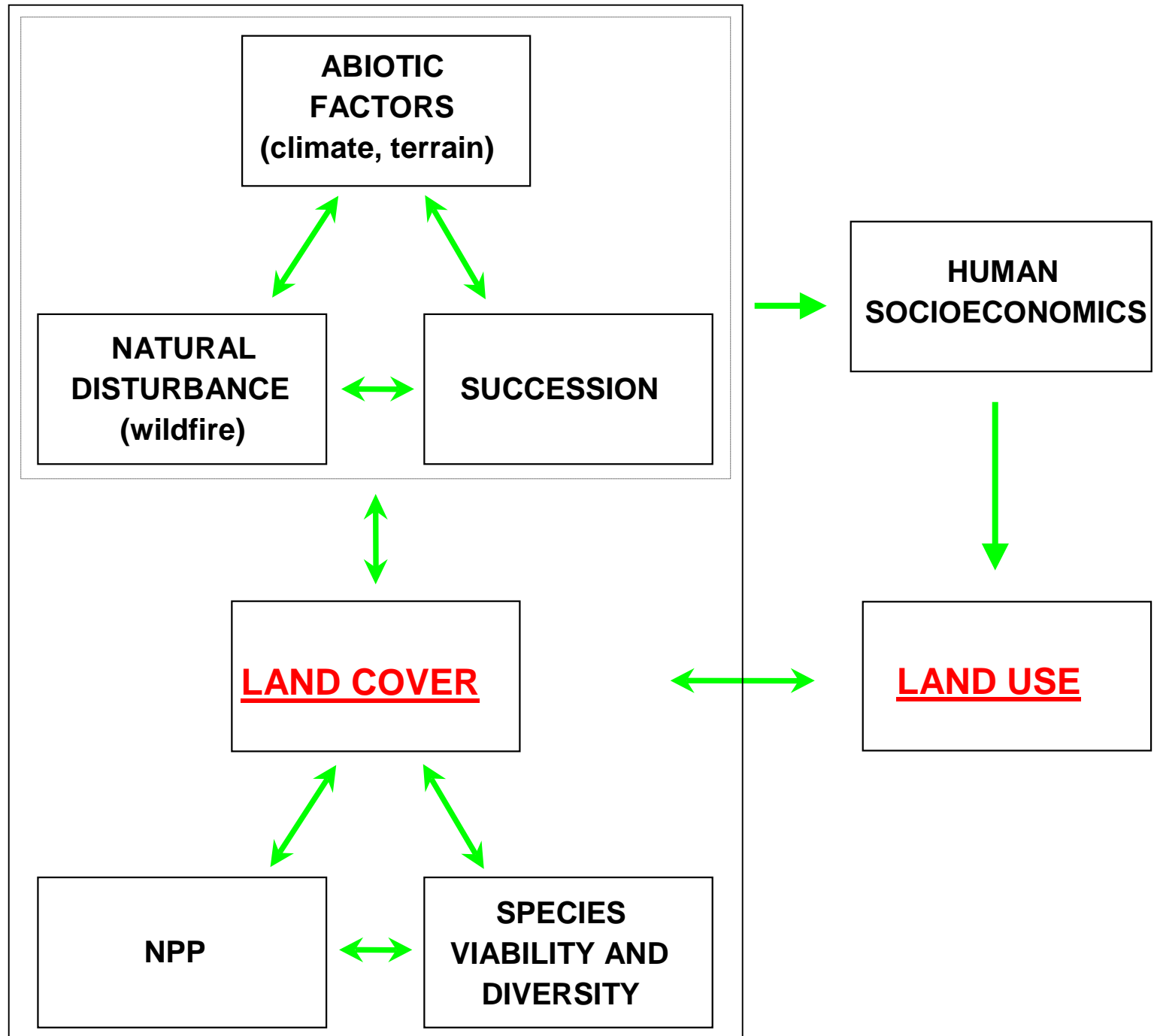


**Forcing  
Functions**

**Ecological  
Processes**

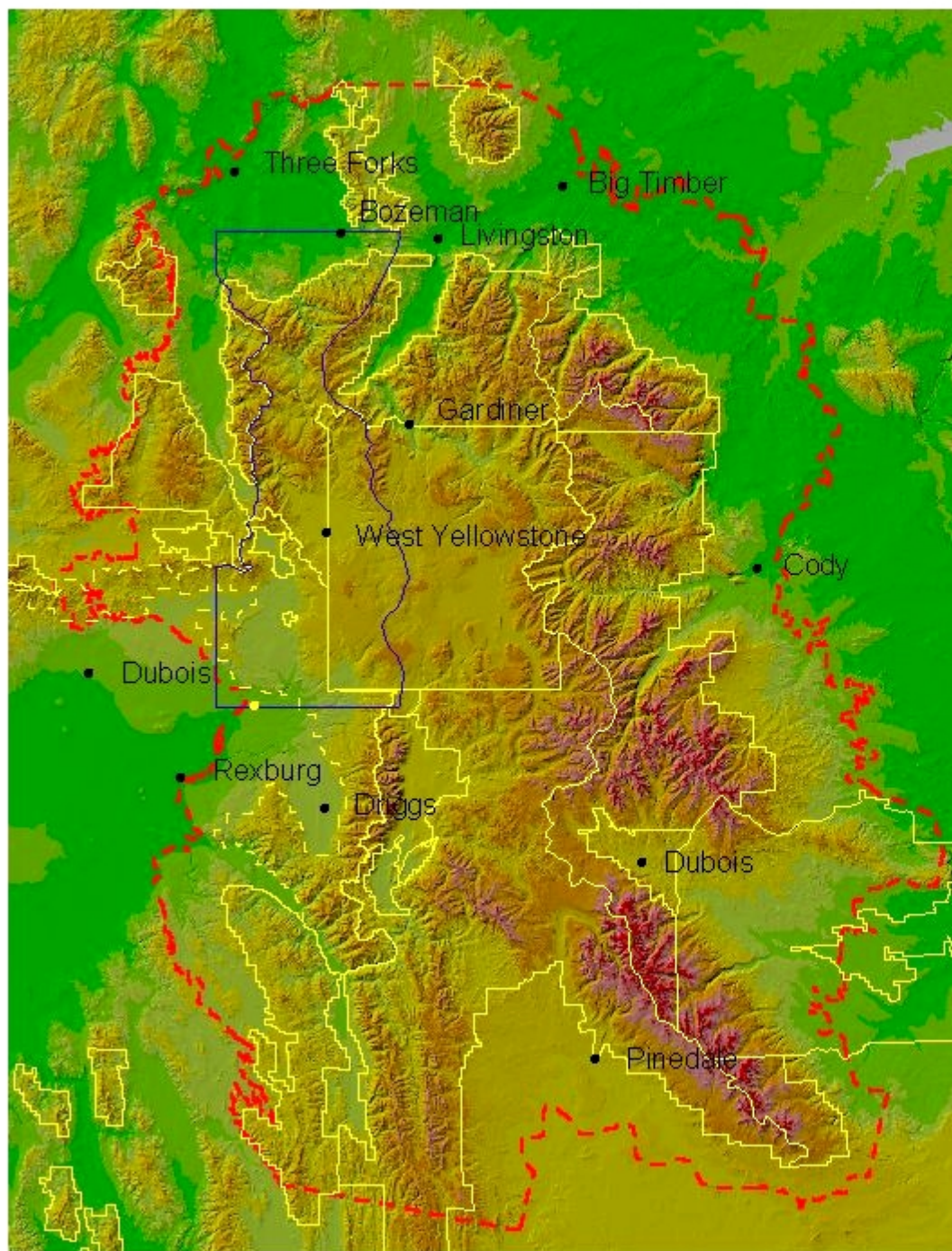
**Land Cover**

**Ecological  
Responses**



# Objectives

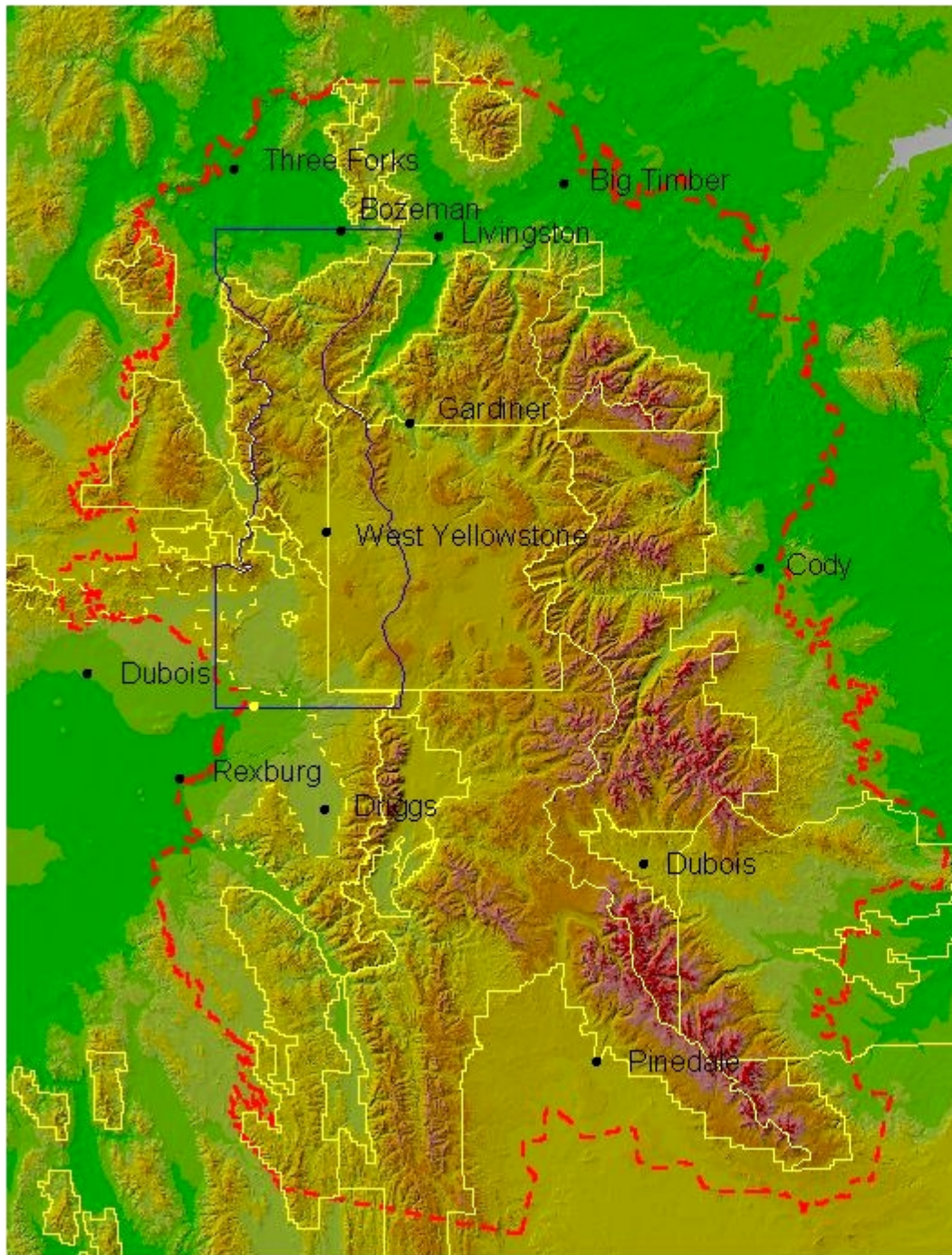
- **1. 25-Year History of GYE:** Quantify changes in biophysical gradients, biodiversity, and land use and socioeconomic factors across the GYE from 1972-1996.
- **2. Causes and Consequences:** Test hypotheses on interactions among biophysical gradients, biodiversity, and socioeconomic patterns.
- **3. Risk:** Assess current and future risk to ecological hot spots and potential for restoration.
- **4. Pulse Taking:** Develop and implement an approach to monitor ecological and human interactions.
- **5. Policy:** Communicate results to stakeholders.



## Study Area Boundaries



# Study Area Boundaries



- 98,000-km<sup>2</sup>
- 7 Landsat TM scenes
- 1500-3800 m elevation
- 3 states
- 7 national forests
- 2 national parks
- 20 counties

## Obj 1. 25-Year History of GYE

Variable	Source	Scale
Land cover/use	Landsat-TM, MSS	30-80 m
Biodiversity	Field/GIS	2 ha
Human Demographics	Census	County
Human Economics	Public records	100 m
Human Sociology	Bur. Econ. Ana.	County
Climate	PRISM	1 km

## Land Cover Approach

### Experimental Design

- **3 Pilot Areas**
- **3 Years of Imagery:** 1976, 1985, 1994
- **2 Dates per Year:** (June, August)

### Each Pilot Area

- **Reference Data:** Collect calibration for each pilot area.
- **Classification Model:** Develop CART model.
- **Image Classification:** Apply CART model to image.
- **Change Detection:** Quantify change over time.

### GYE-Wide

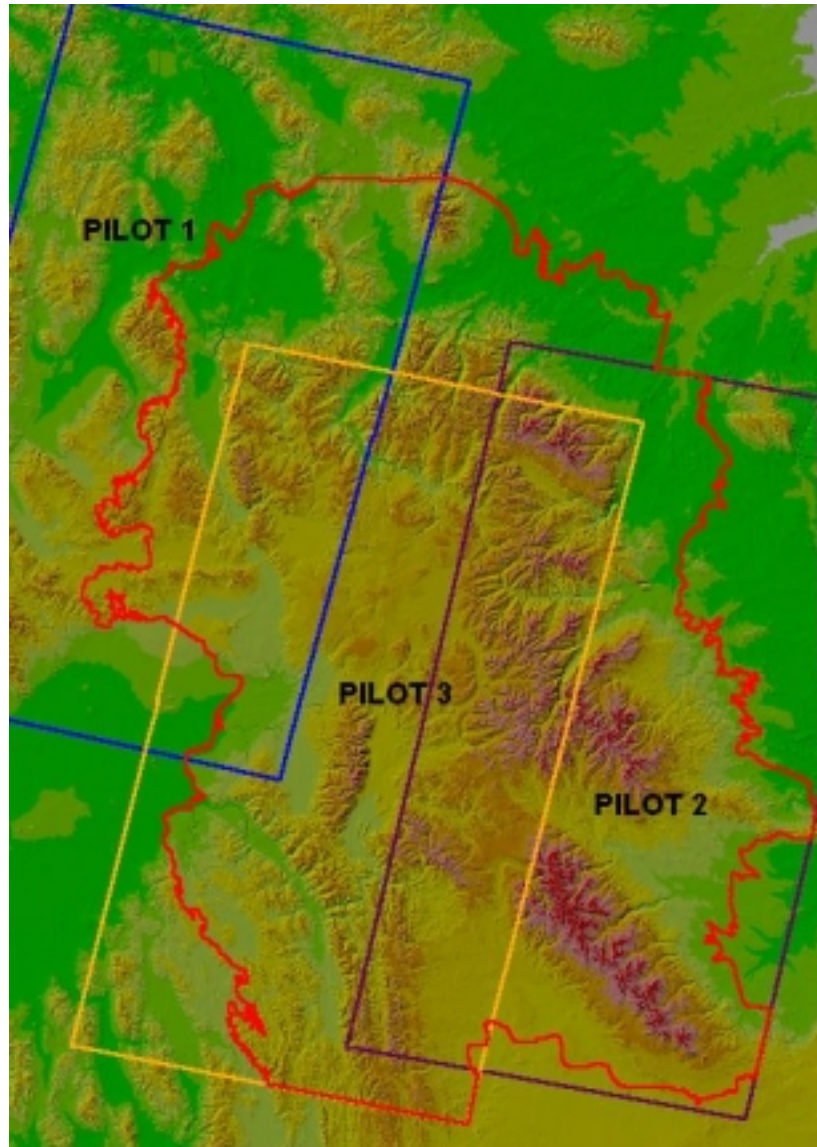
- **Image Classification:** Apply CART across GYE.

## Land Cover Classes

LEVEL I	LEVEL II	LEVEL III
Non Veg	Snow/Ice/Cloud Bareground/Rock Water Urban	
Agriculture	Agriculture	Perennial (Grazing/Pasture/CRP) Annual (Crop/Hay/Fallow)
Natural Vegetation	Conifer	- Conifer (mixed) - Douglas Fir - Clearcut - Burned
	Hardwood	- Aspen - Willow - Cottonwood
	Herbaceous	- Sage - Grassland



# Pilot Areas

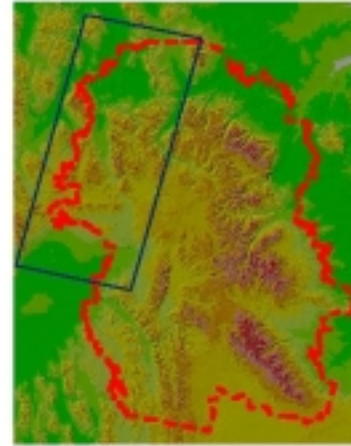
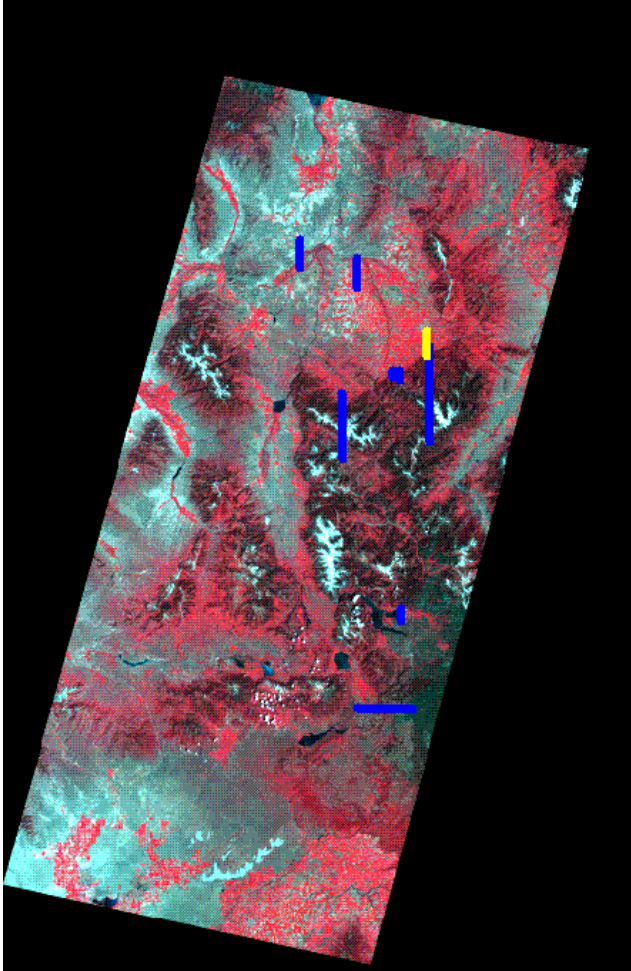


- GYE Boundary
- Pilot 1 Boundary
- Pilot 2 Boundary
- Pilot 3 Boundary

## Reference Data Collection

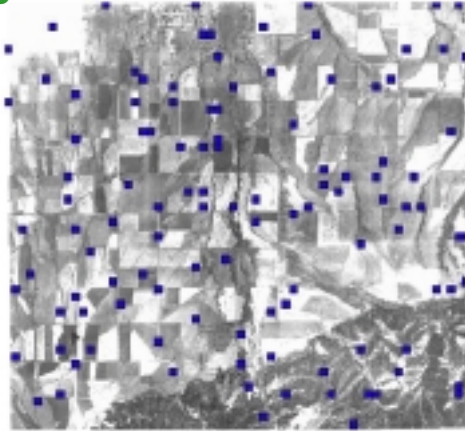
- **1. Designate transects within pilot areas.**
- **2. Identify random points along transects within cover type, elevation, aspect strata.**
- **3. Sample 30-100 points per cover type distributed across elevation and aspect.**

## 25-Year History - Land Cover



**Transects for  
Reference Data:  
Pilot Area 1**

## 25-Year History - Land Cover



**Sample Points  
on Aerial  
Photos**



**Sample Points  
on Landsat  
Image**

**Land Cover  
Identification**



# Reference Data: Pilot Area 1

Number of Photo Interpreted Plots by Year and Land Cover				
Class		1976	1985	1994
LEVEL 1	Agriculture	198	181	194
	Non-Vegetation	383	372	340
	Natural Vegetation	25	21	18
	LEVEL 1 TOTALS	542	574	646
LEVEL 2	Conifer	148	160	171
	Hardwood	50	45	36
	Herbaceous	60	90	75
	LEVEL 2 TOTALS	282	295	258
LEVEL 3	Perennial Agriculture	41	32	41
	Annual Agriculture	76	97	88
	Conifer	38	40	40
	Douglas Fir	23	22	25
	Aspen	32	32	32
	Cottonwood	17	18	18
	Willow	23	21	20
	Sage Grassland	21	21	21
	Grassland	19	19	19
	LEVEL 3 TOTALS	303	202	290

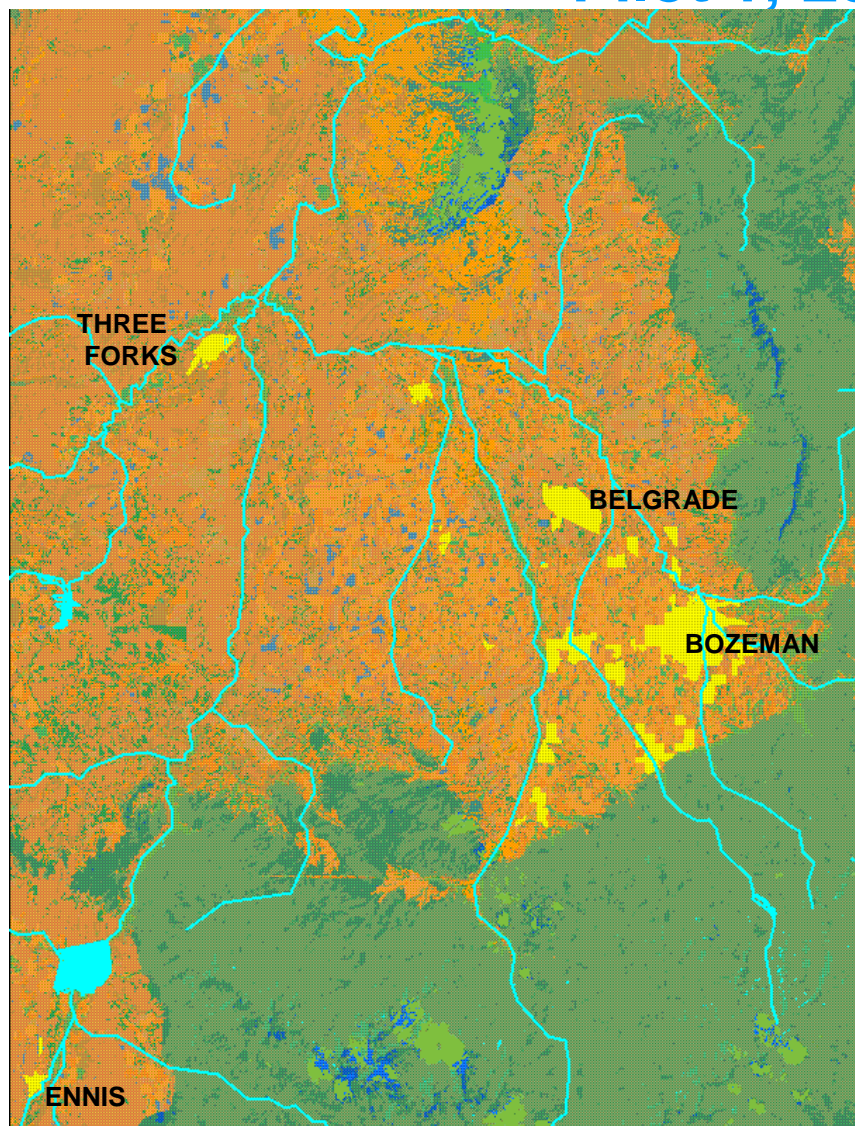


## Classification Methods

- **1. Extract Explanatory-variable Data:** for each reference data point.
- **2. Develop CART Rules:** for each classification level and cover type using reference and explanatory data (32 variables).
- **3. Apply Rules:** create a classified map for each level.
- **4. Evaluate Accuracy:** use independent validation data
- **5. Extrapolate:** apply classification rules across the GYE for all years, all levels

# Preliminary Classification Results

Pilot 1, Level 1, 1994



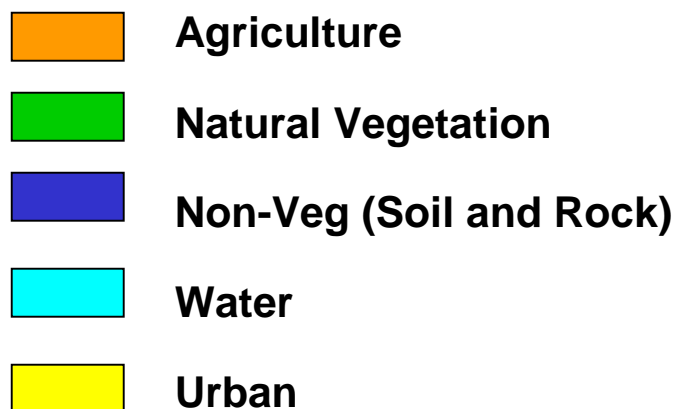
## User's Accuracies for Level 1

AGRICULTURE 84%

NON-VEG 75%

NATURAL VEG 97%

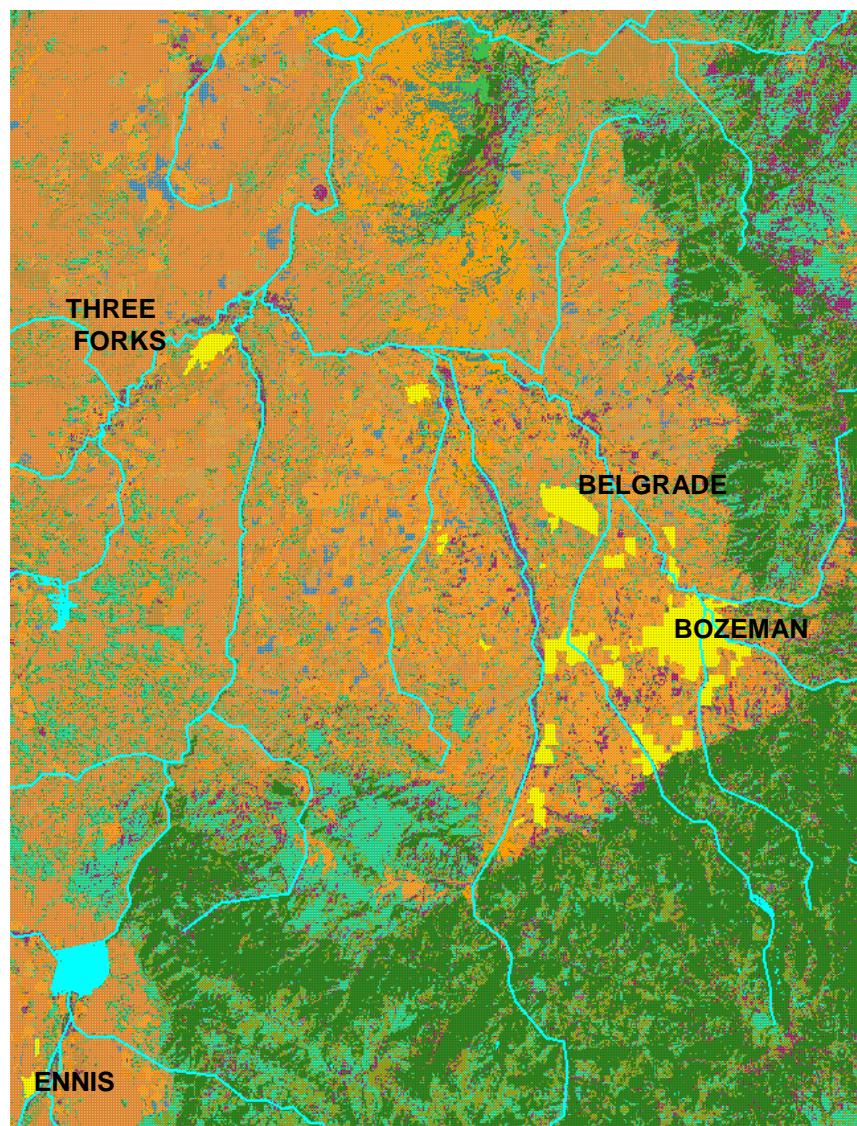
Overall Classification Accuracy = **91%**





# Preliminary Classification Results

Pilot 1, Level 2, 1994



User's Accuracies for Level 2

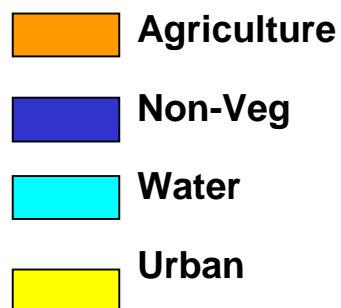
CONIFER 87%

HERBACEOUS 70%

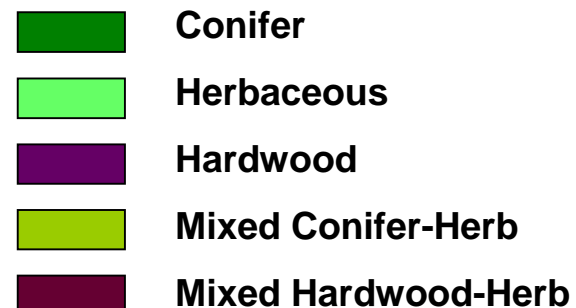
HARDWOOD 73%

Overall Classification Accuracy = **76%**

**Level 1**



**Level 2**

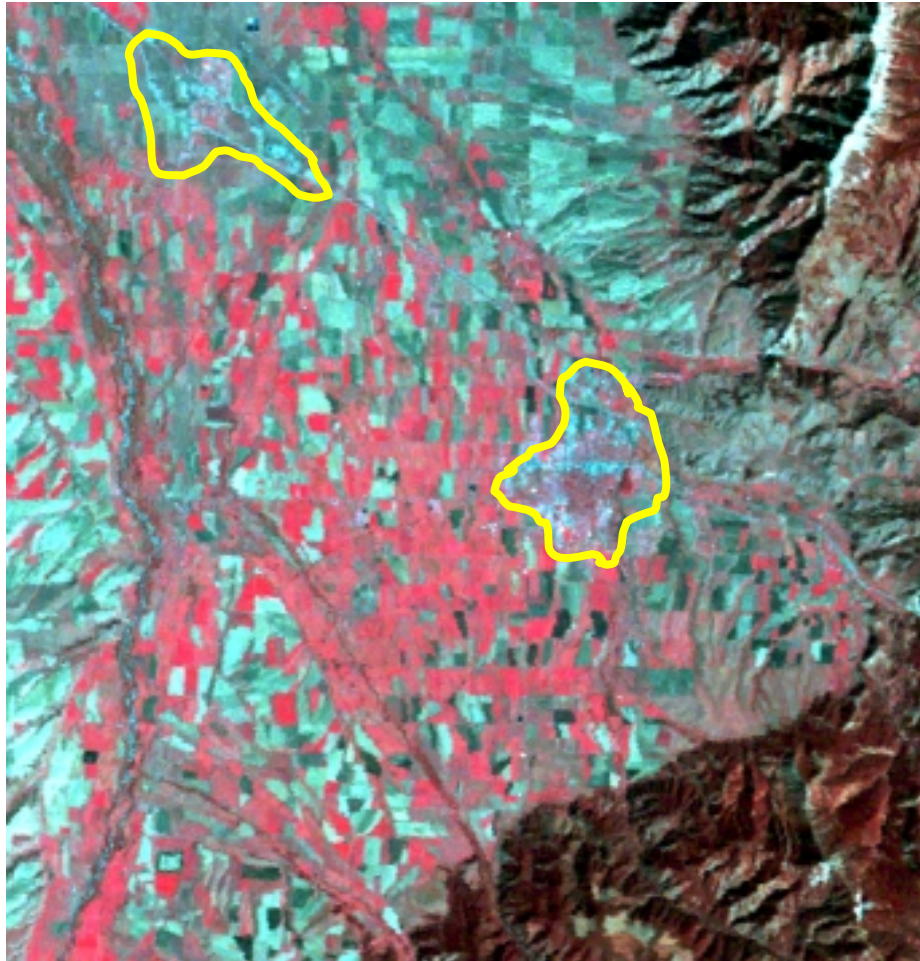


# Change Detection

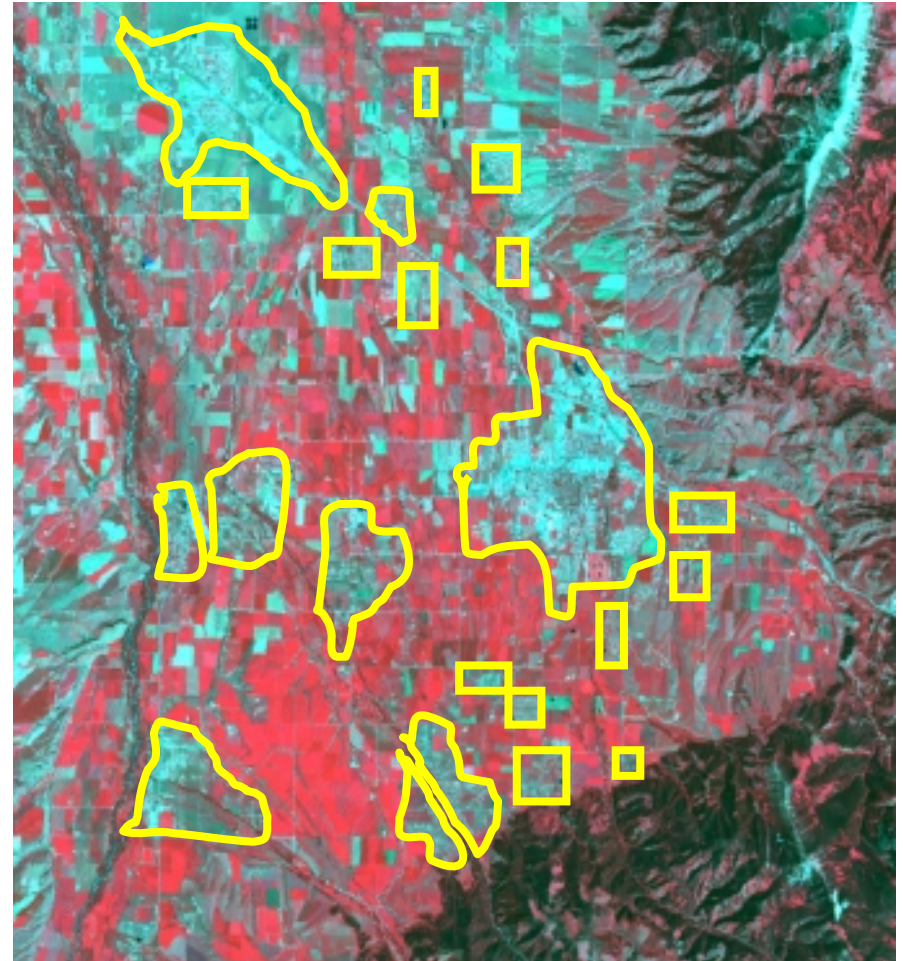
- **Method 1: Traditional Difference Approach**
- **Method 2: Cohen Difference Threshold Approach**
- **Compare Methods 1 and 2 and use best.**



## Change: Gallatin Valley, MT



**1976**  
**MSS Imagery 4-2-1**



**1994**  
**TM Imagery 4-3-2**

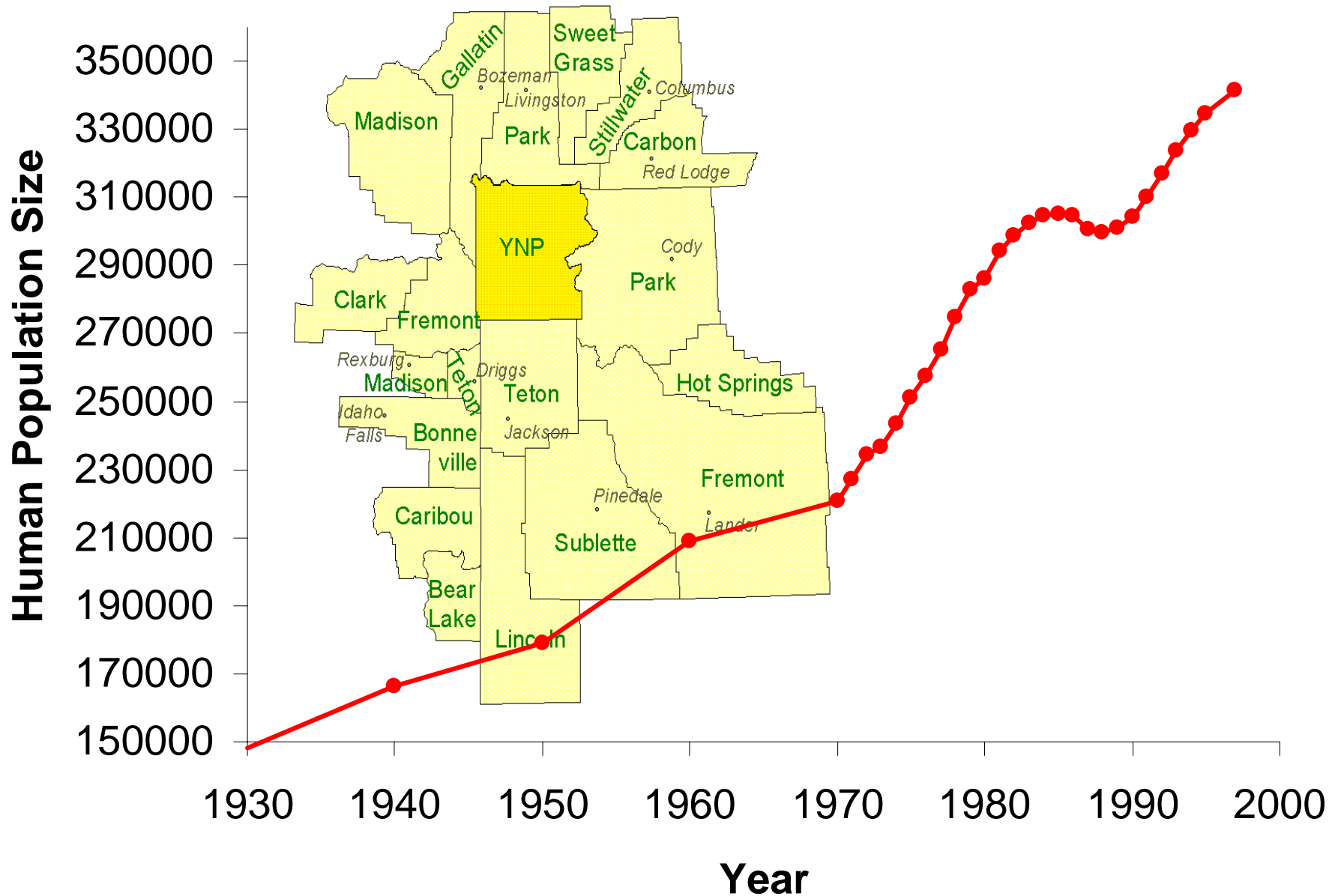


## Land Cover Classification: Status

Task	Area			
	Pilot 1	Pilot 2	Pilot 3	GYE
Develop methods	X	X	X	X
Acquire imagery	X	X	X	X
Obtain reference and predictor data	X	X		
Classify and Validate	X			
Detect Change				

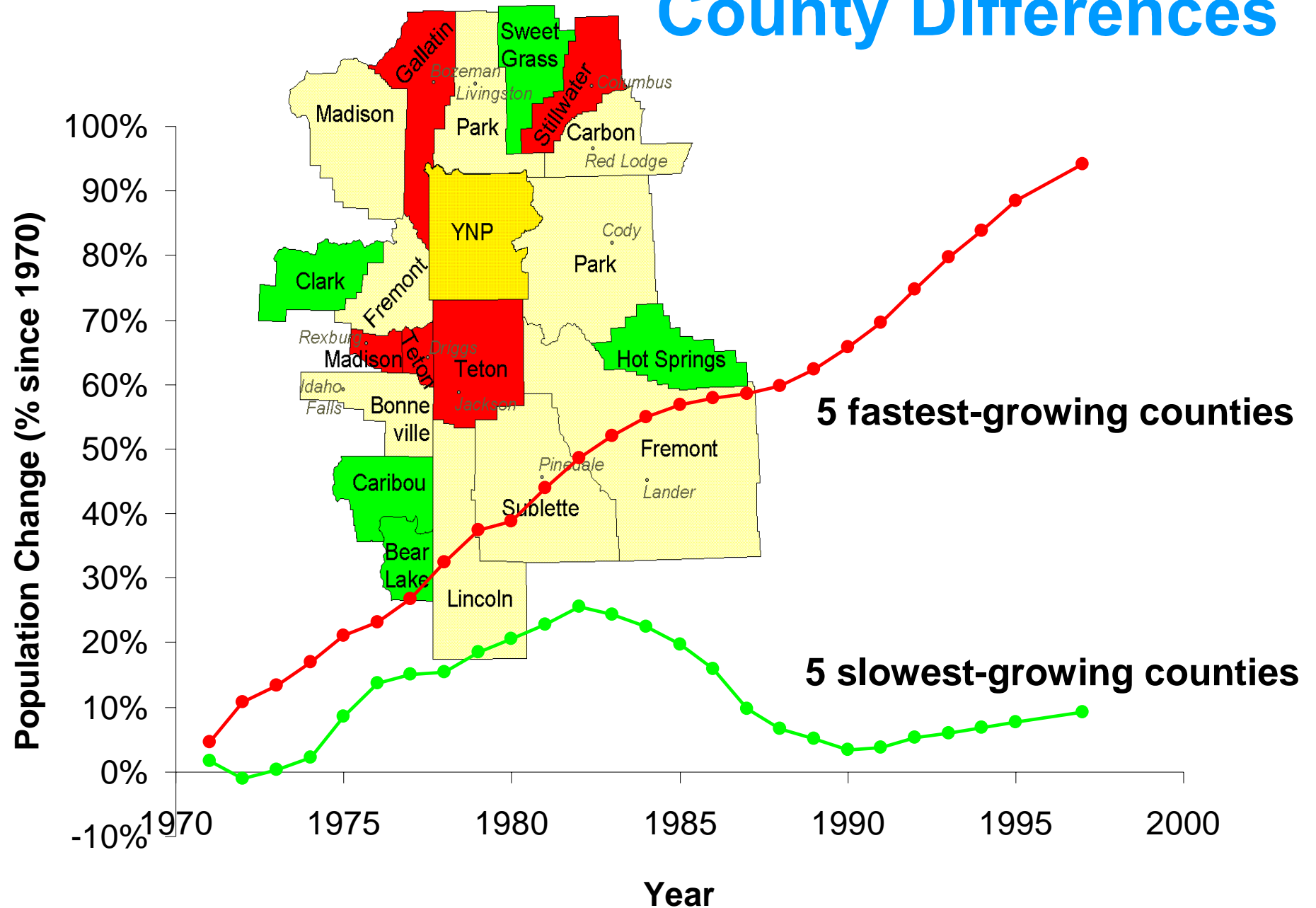
## 25-Year History

# Human Demography - GYE-Wide



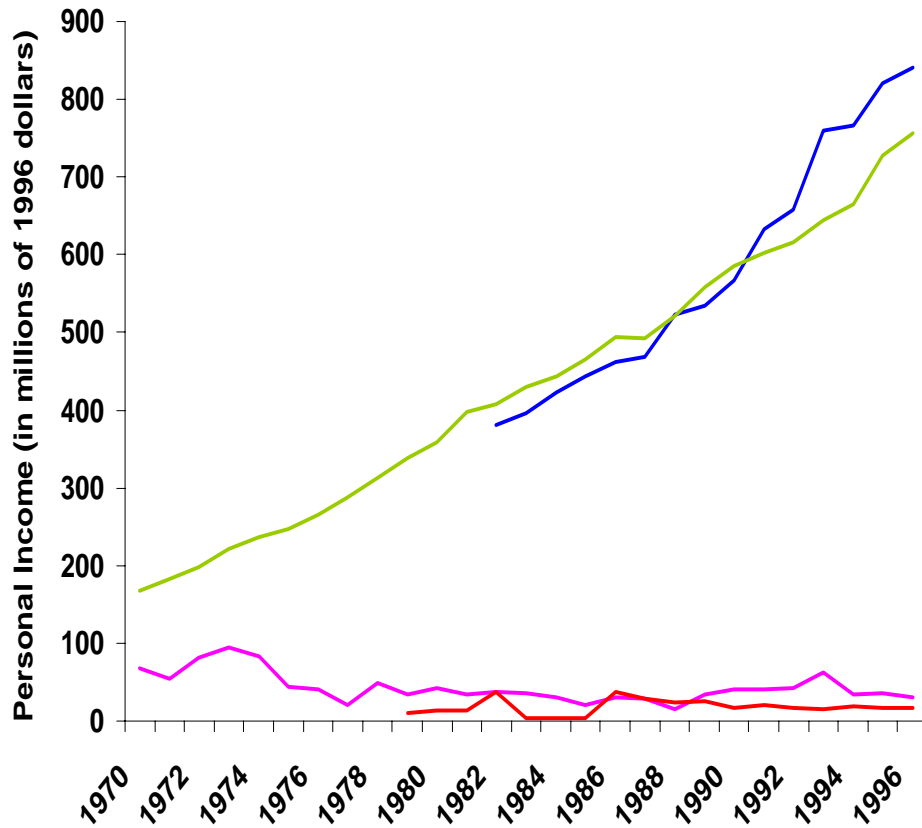
## 25-Year History

# County Differences

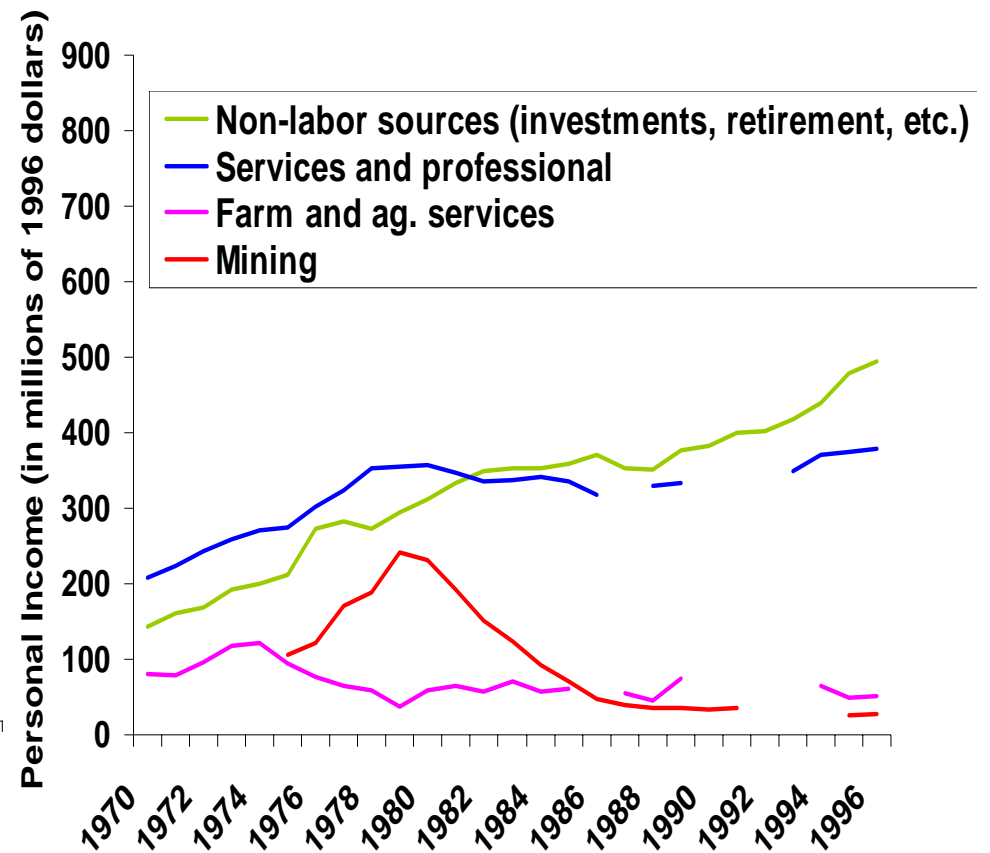


# Economic Trends: County Differences

## Four Fastest Counties

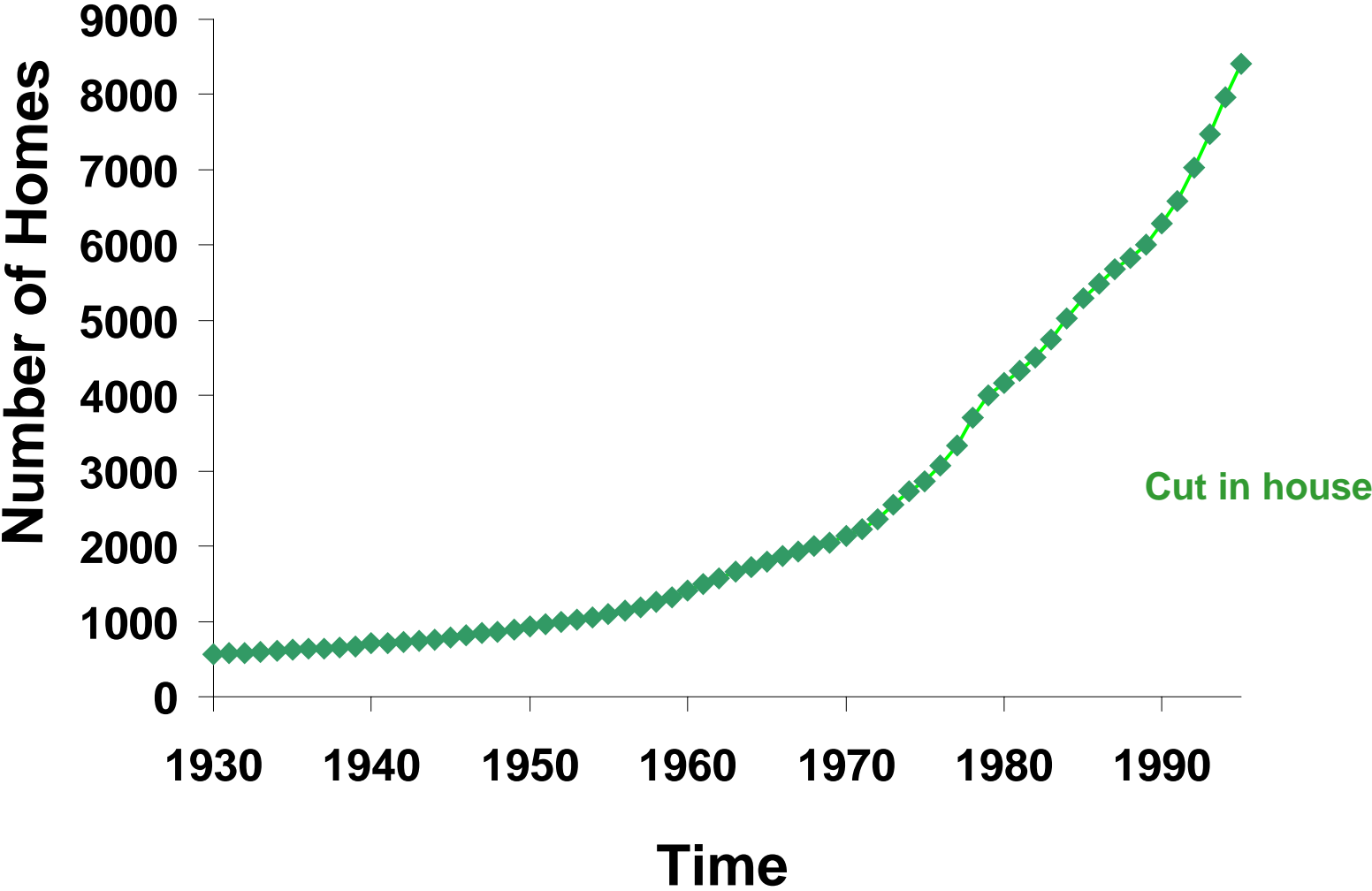


## Four Slowest Counties



25-Year History

# Rural Residential Development: Gallatin Co, MT





## 25-Year History: Status

Task	Topic			
	Demo- graphy	Economic	Social	Biodiversity
Obtain data	X	X	X	
Analyze data	X	X		
Prepare publications				

### Expected Products:

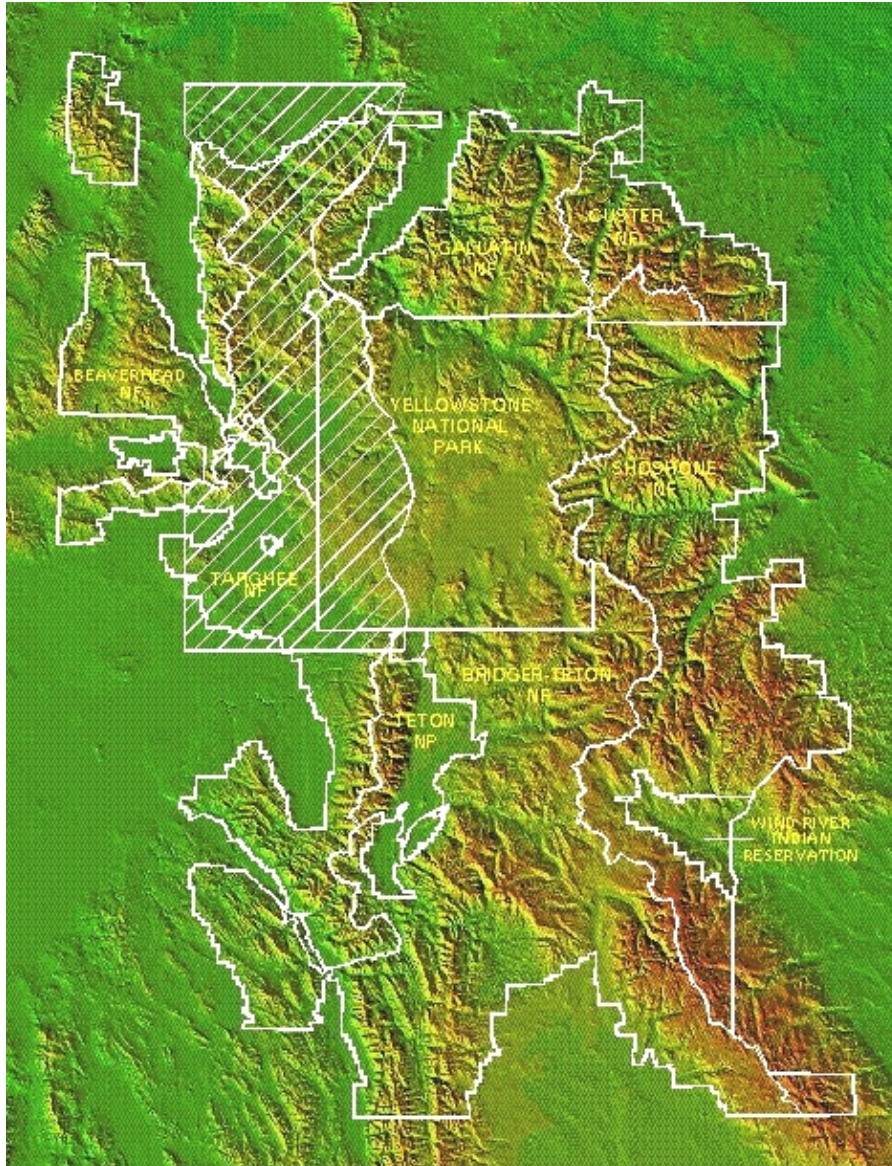
- Hansen et al. Twenty-five year history of the Greater Yellowstone Ecosystem. (2000).

## Objective 2: Hypotheses

- **H1: Abiotic factors cause NPP to be low and variable over most of the GYE.**
- **H2: Biodiversity is correlated with abiotic gradients and NPP and is high only in hot spots.**
- **H3: Human land use is most intense near hot spots.**
- **H4: Socioeconomic performance is influenced by ecological factors.**
- **H5: Intense land use reduces the population viability of some native species.**

Obj 2: Hypothesis testing

# SPATIAL PATTERNS OF NPP



## Hypothesis 1:

**Patchy topography, climate, and soil cause NPP to be low and variable over most of the GYE.**

## Methods

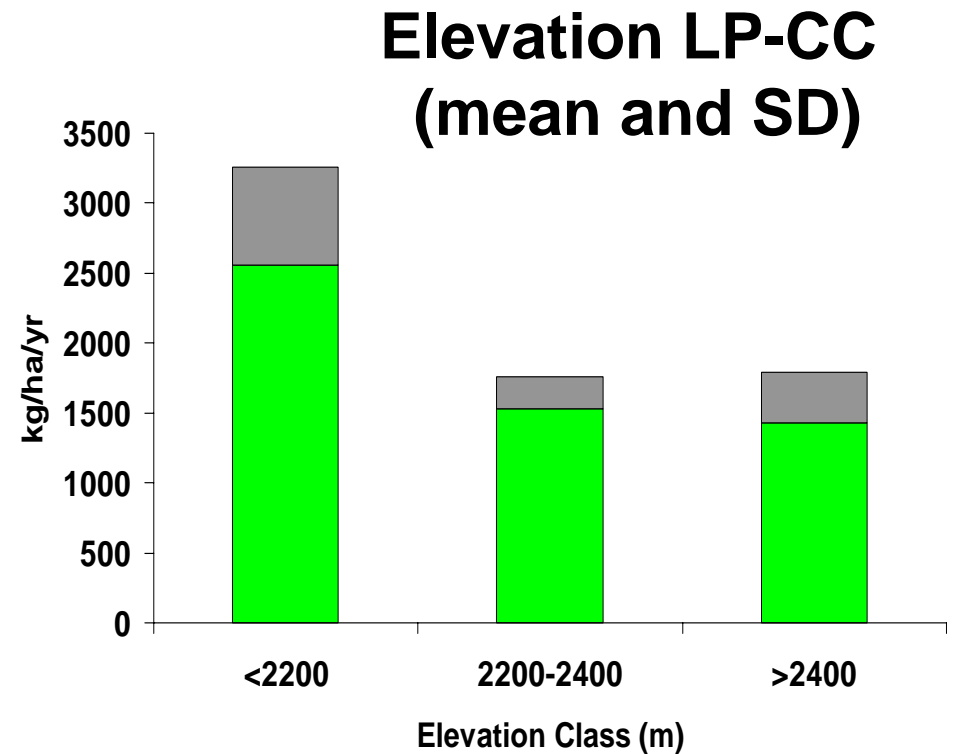
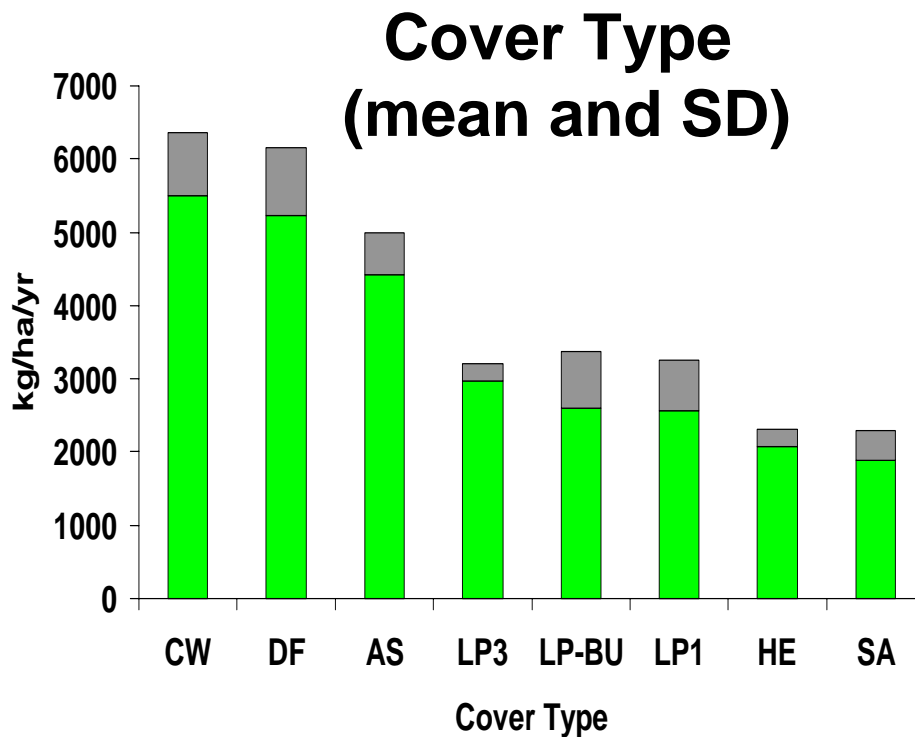
- **Select field sites (100) stratified over biophysical gradients.**
- **Collect data on vegetation dimensions and growth rates.**
- **Use allometric relationships to predict biomass change/year.**
- **Extrapolate ANPP from sites to study area.**
- **Analyze spatial patterns of ANPP.**

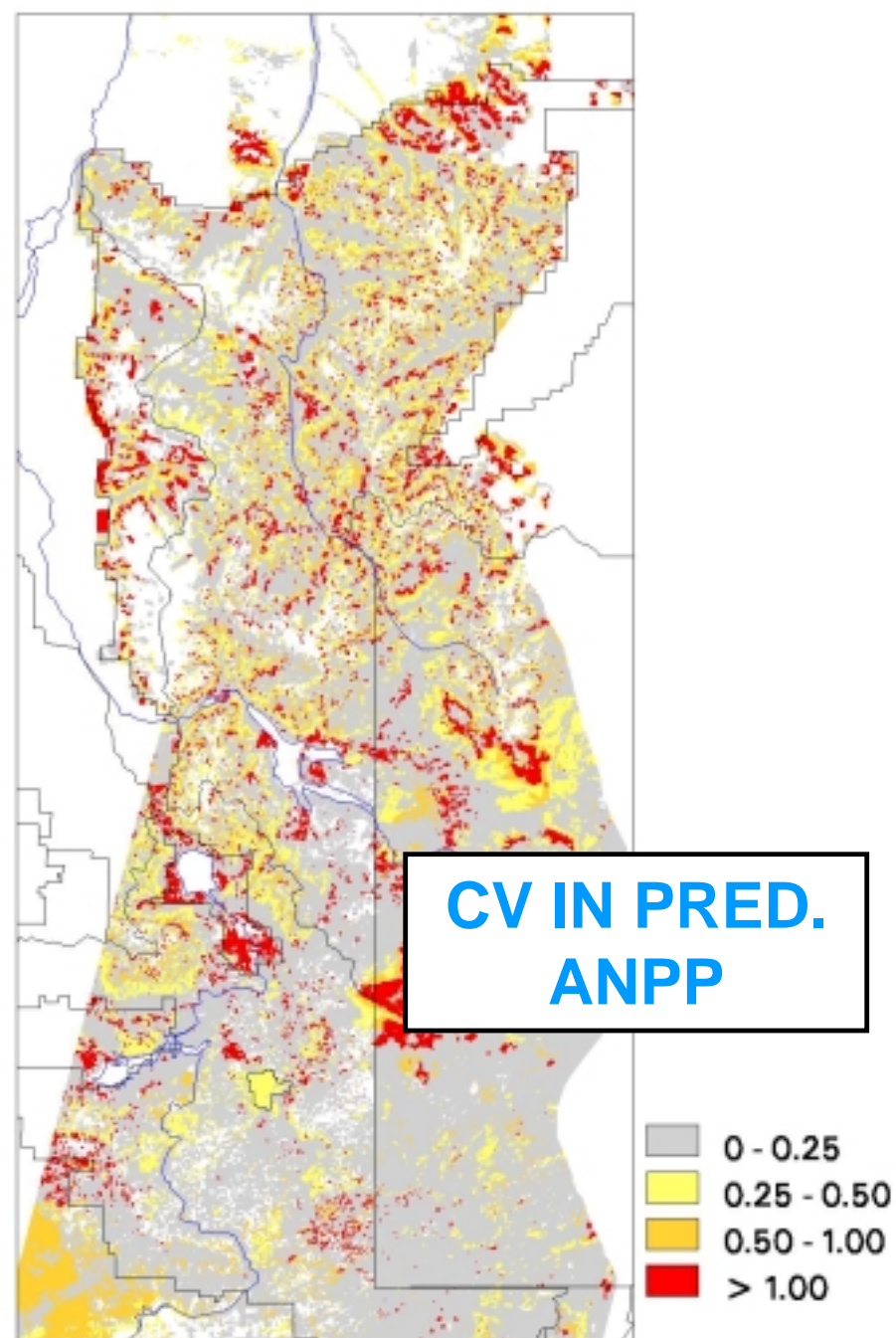
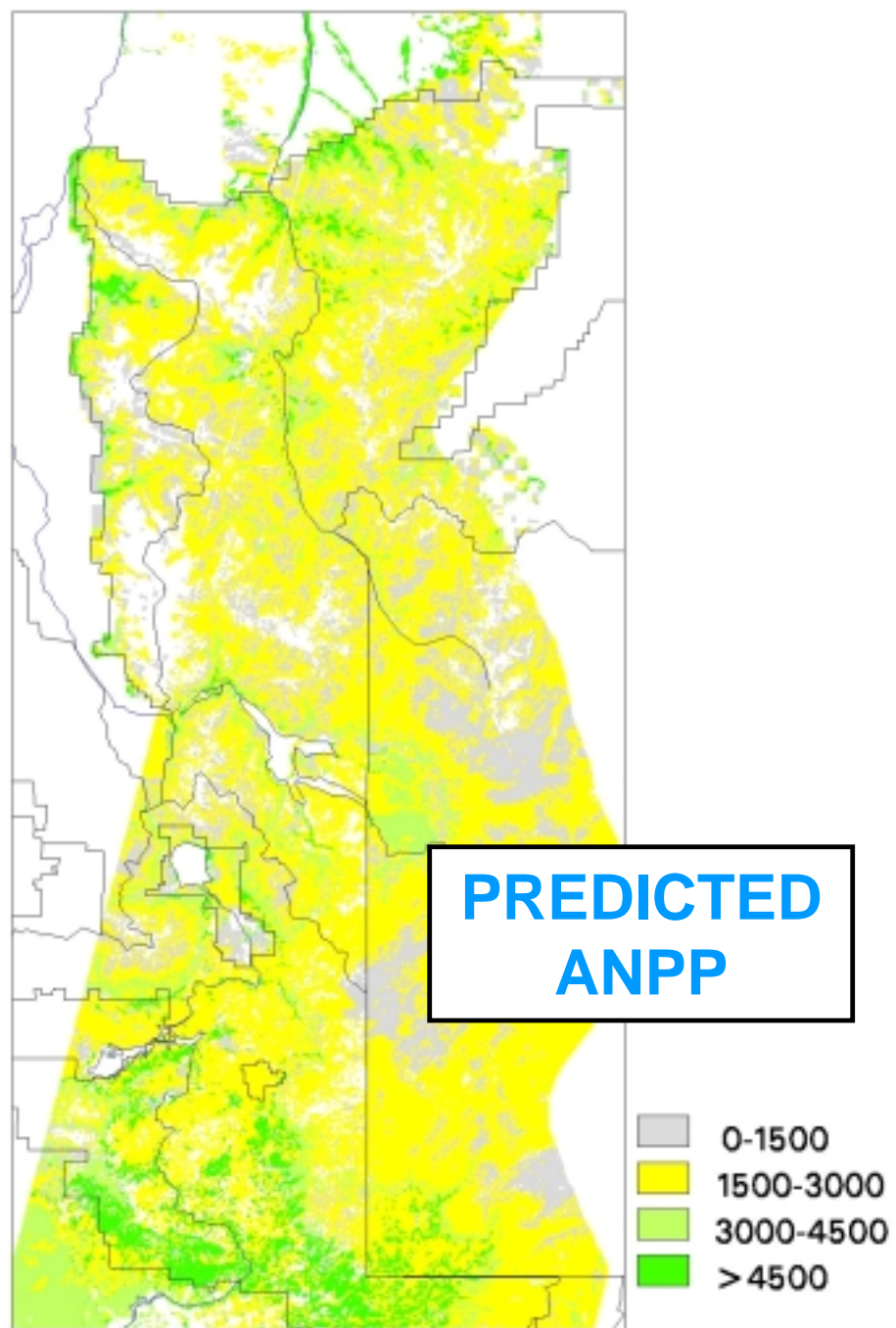


## Results

■ **Predictor variables evaluated**: elevation, slope, aspect, specific catchment area, parent material, cover type.

■ **Best Model**: ANPP = cover type, elevation, interaction ( $R^2=.89$ ,  $P<.0001$ ).





# SPATIAL PATTERNS OF BIODIVERSITY

## Hypothesis 2:

**Strong abiotic gradients  
(topography, climate, soil)  
cause native species  
abundances and richness to  
be high only in localized hot  
spots across the landscape.**

## Methods

- **Select field sites (100) stratified over biophysical gradients.**
- **Collect data on abundance of bird, shrub, and tree species.**
- **Extrapolate species abundances and richness from sites to study area.**
- **Analyze spatial patterns of biodiversity.**





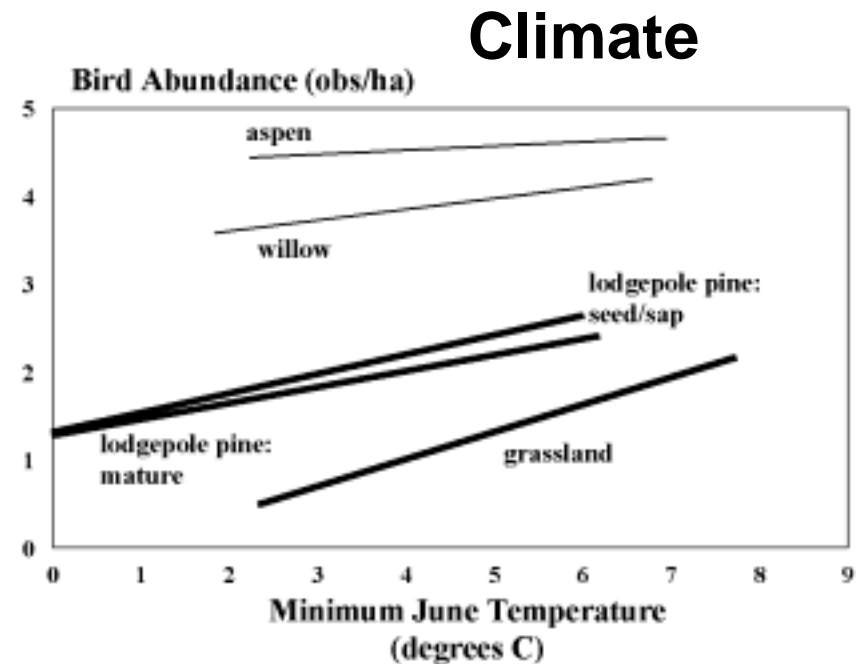
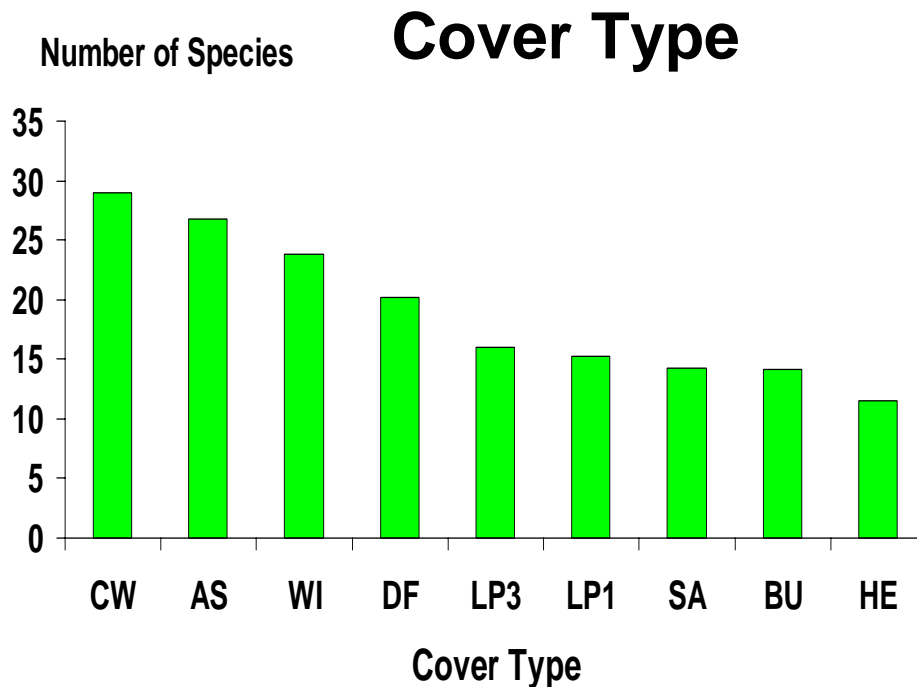
# PREDICTOR VARIABLES

Theme	Source	Methods
Elevation, Slope, Aspect	USGS DEM	Derive from DEMs
Specific Catchment Area	DEM and	Derive with Arc-Info Watershed Function
Monthly Temp., Monthly Precip., Snow-melt Date	Met Stations	Regressed based on elevation and/or latitude. Averaged over 1995-97
Parent Material Type	Soils Maps	Soil types grouped into parent material classes
Vegetation Cover Type	Field	Simple cover type classification
Vegetation Structure	Field	Structural complexity indices developed from field data
ANPP	Field	Total, deciduous, and coniferous ANPP developed with BIOPAK and field data.

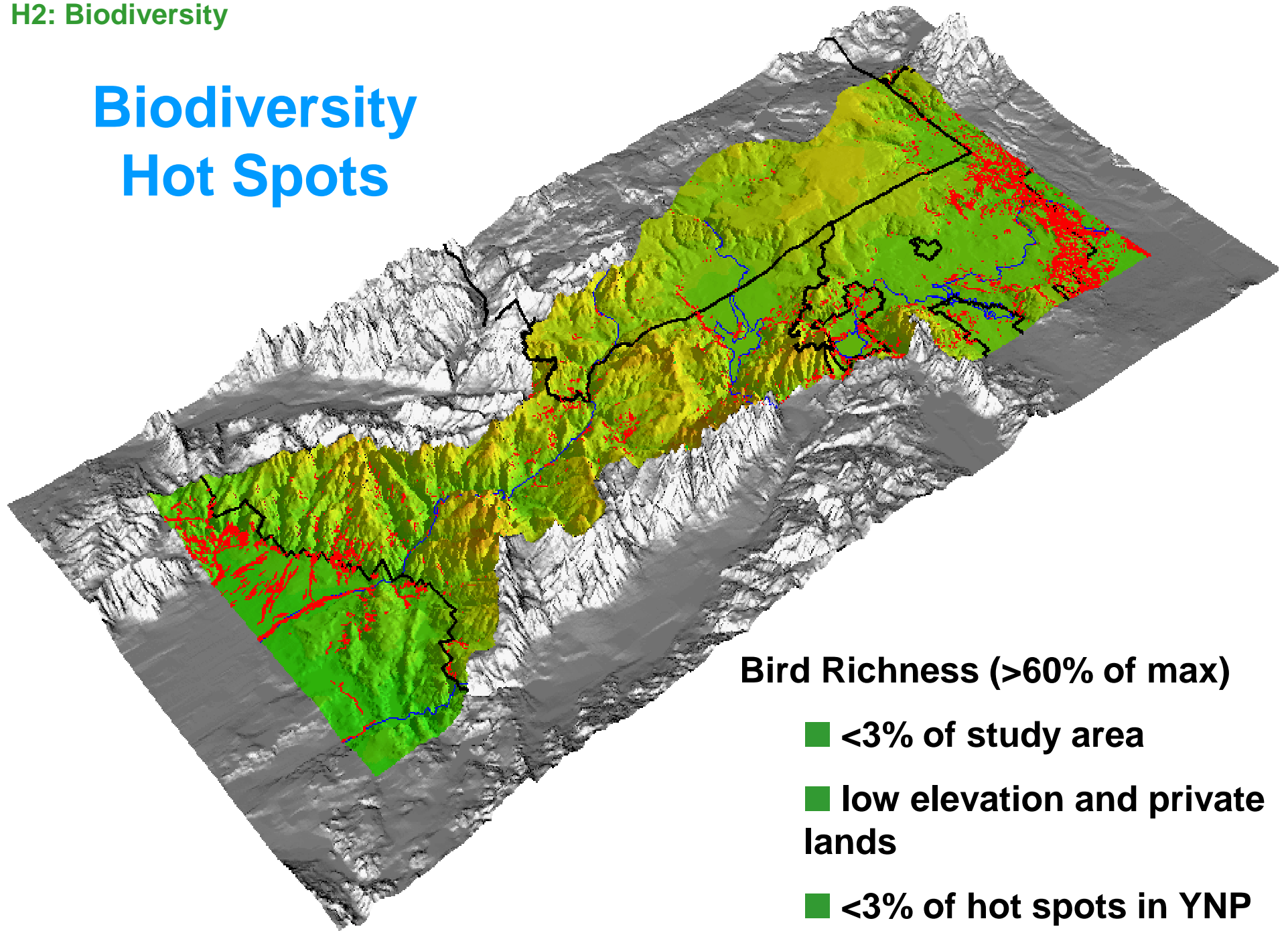
## Results: Bird Richness

■ Predictor variables evaluated: elevation, slope, aspect, parent material, climate (6 variables), veg structure, ANPP, cover type.

■ **Best Model: Richness = cover type, climate, parent material ( $R^2=.89$ ,  $P<.0001$ ).**



# Biodiversity Hot Spots



# Human Settlement and Biodiversity

## Hypothesis 3:

**Human land use is correlated with environmental gradients such that land use is most intense at hot spots for biodiversity.**





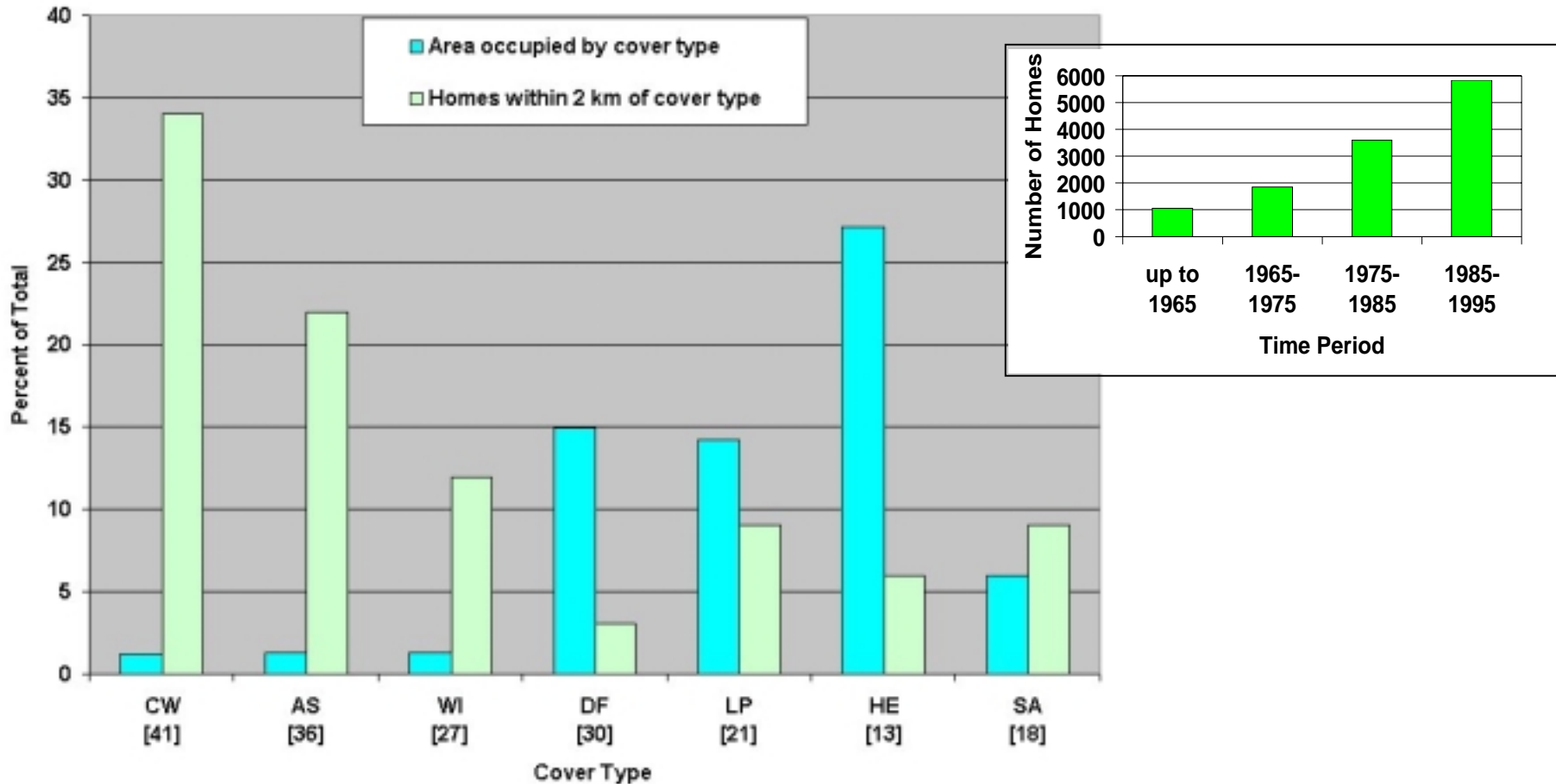
## Methods

- Obtain home locations from sewer and well records, aerial photos, and field survey.
- Analyze spatial distribution relative to ecological, social, economic factors.
- Evaluate causes of home location from home-owner surveys.



### H3: Human Settlement

## Preliminary Results



## Distribution of Homes Relative to Cover Types

# Socioeconomic Performance and Biodiversity

## Hypothesis 3:

**Population and income growth are associated with both socioeconomic and ecological factors .**

## Methods

**socioeconomic performance =  $f(x_1, x_2, \dots, X_n)$**

**$x_1$  = ecological factors (topography, soils, water, climate, vegetation, biodiversity)**

**$x_2$  = education**

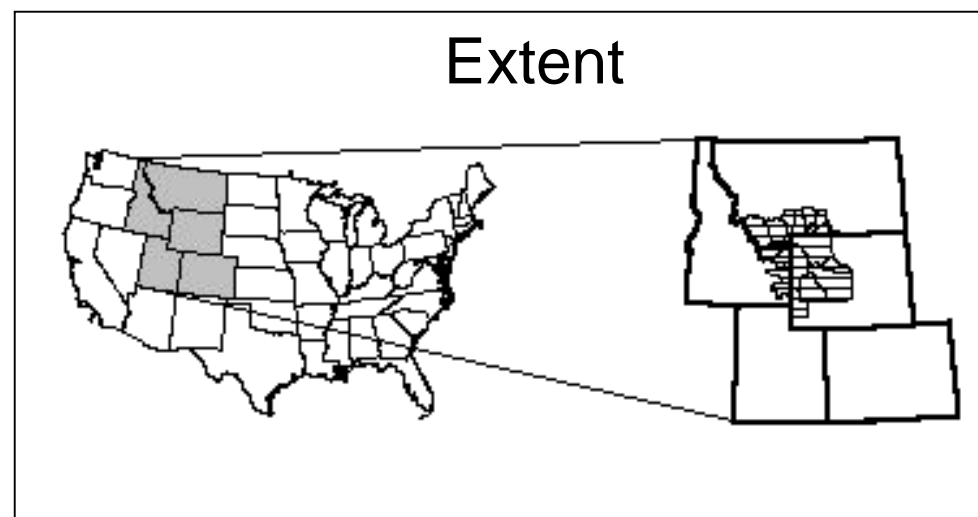
**$x_3$  = justice**

**$x_4$  = commerce**

**$x_5$  = transportation**

**$x_6$  = health**

**$x_7$  = recreation**





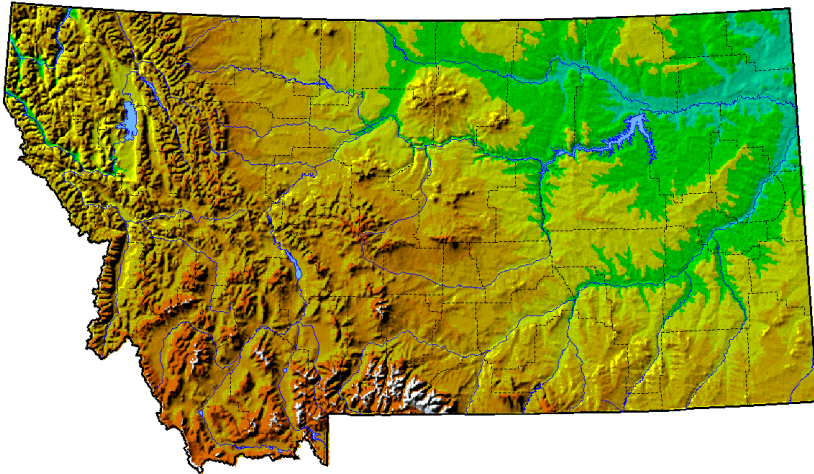
## Results: Rocky Mountains



- 87% of income growth in services (especially producer) and nonlabor sectors.
- Extractive industries had only 2% of new income.
- Rural counties with high socioeconomic performance are often characterized by growth in producer services. e.g., Aspen, Co., Telluride, Co., Vail, CO., Bozeman, MT., Sun Valley, ID.
- Correlates with "producer service" counties: college ed (% of pop.) and airport service. Not proximity to wilderness, national park, wildlife refuge.

#### H4: Socioeconomics

## Results: Montana



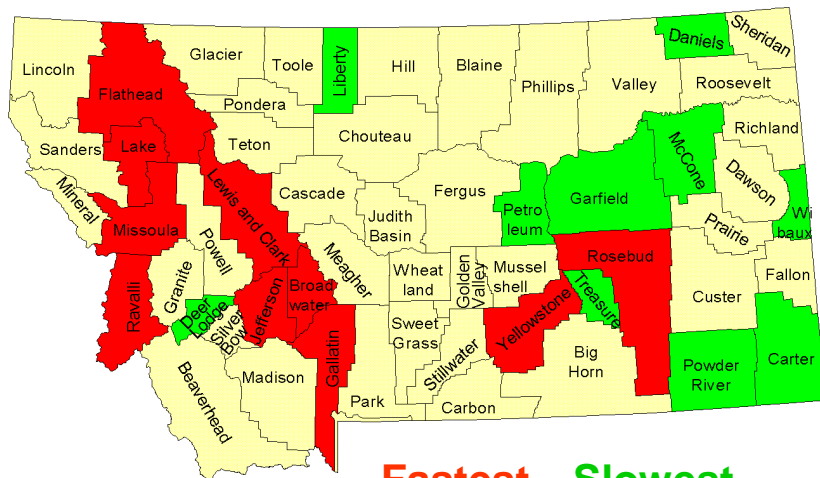
### Potential Predictors

elev ppt temp forest  
reserves, streams, lakes

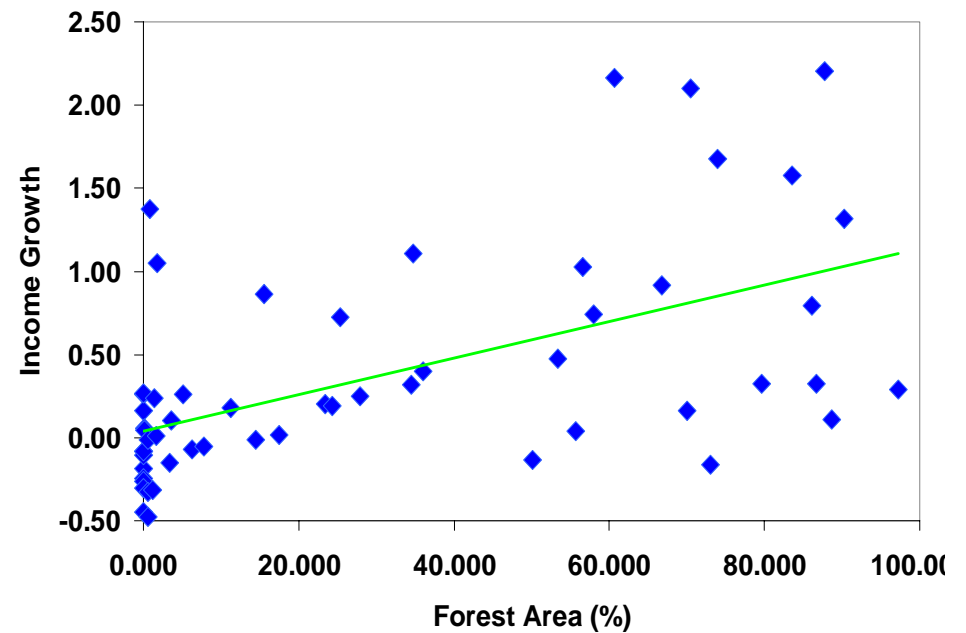
### Best Model

forest tempsd tempm

$R^2=.41$   $P<.001$



Fastest Slowest



## Land Use Effects on Species Viability

### Hypothesis 5:

**Intense land use reduces the population viability of some native species.**

## Methods

- **Locate nests in hot-spot and extensive habitats.**
- **Monitor reproductive success.**
- **Analyze data to determine vital rates and association with land use.**
- **Simulate population growth and probability of extinction.**

## Results: Demography

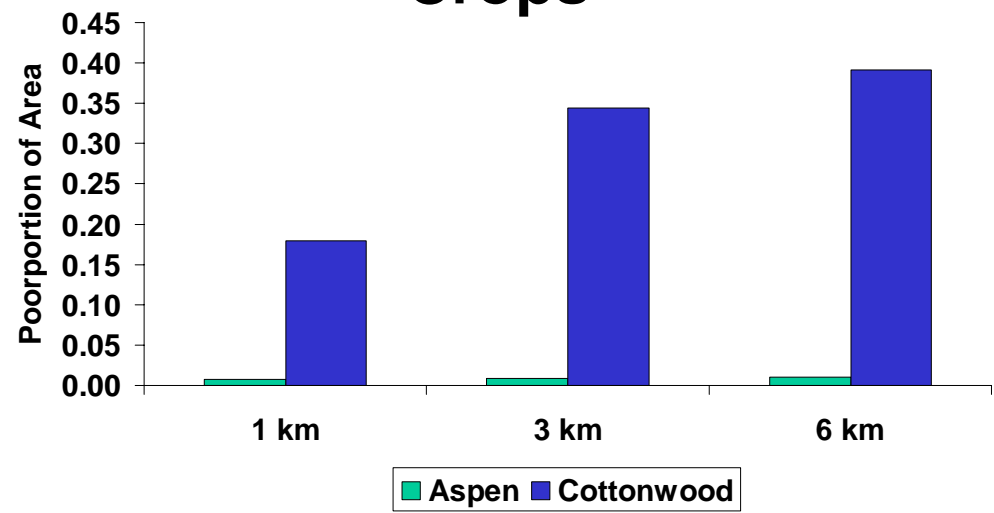
Habitat	Nest Succ.	# Female Fledglings	Pop Growth Rate
AS	54%	0.81	1.13
LP	30%	0.44	0.90
CW	38%	1.32	0.94

Open-Cup Nesters Vulnerable to Cowbirds

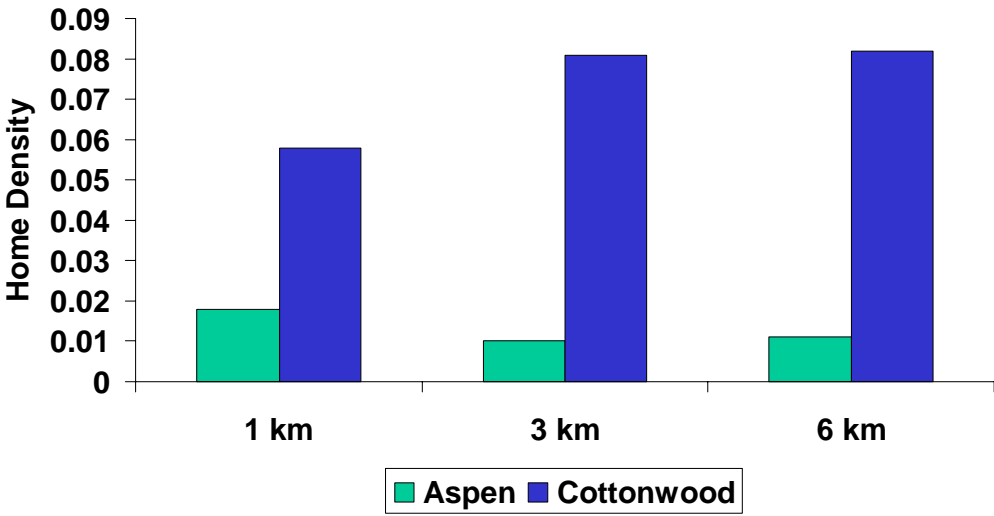


# Results: Land Use

## Crops



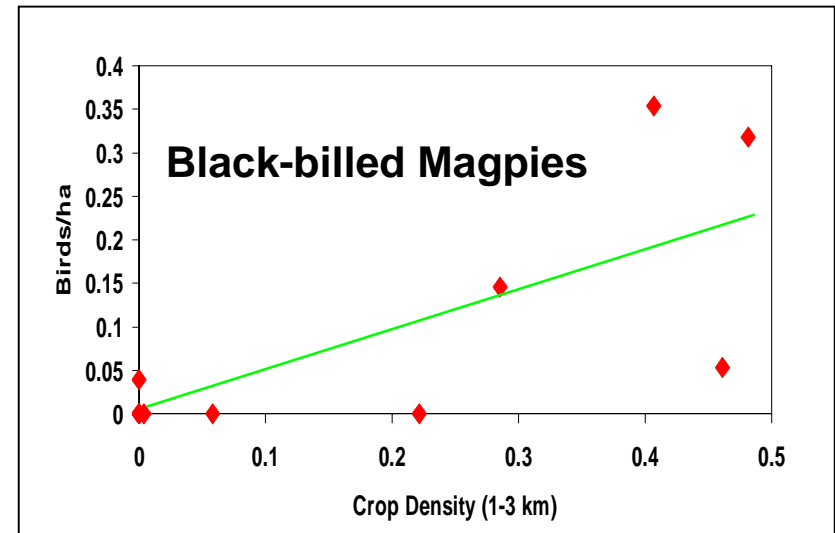
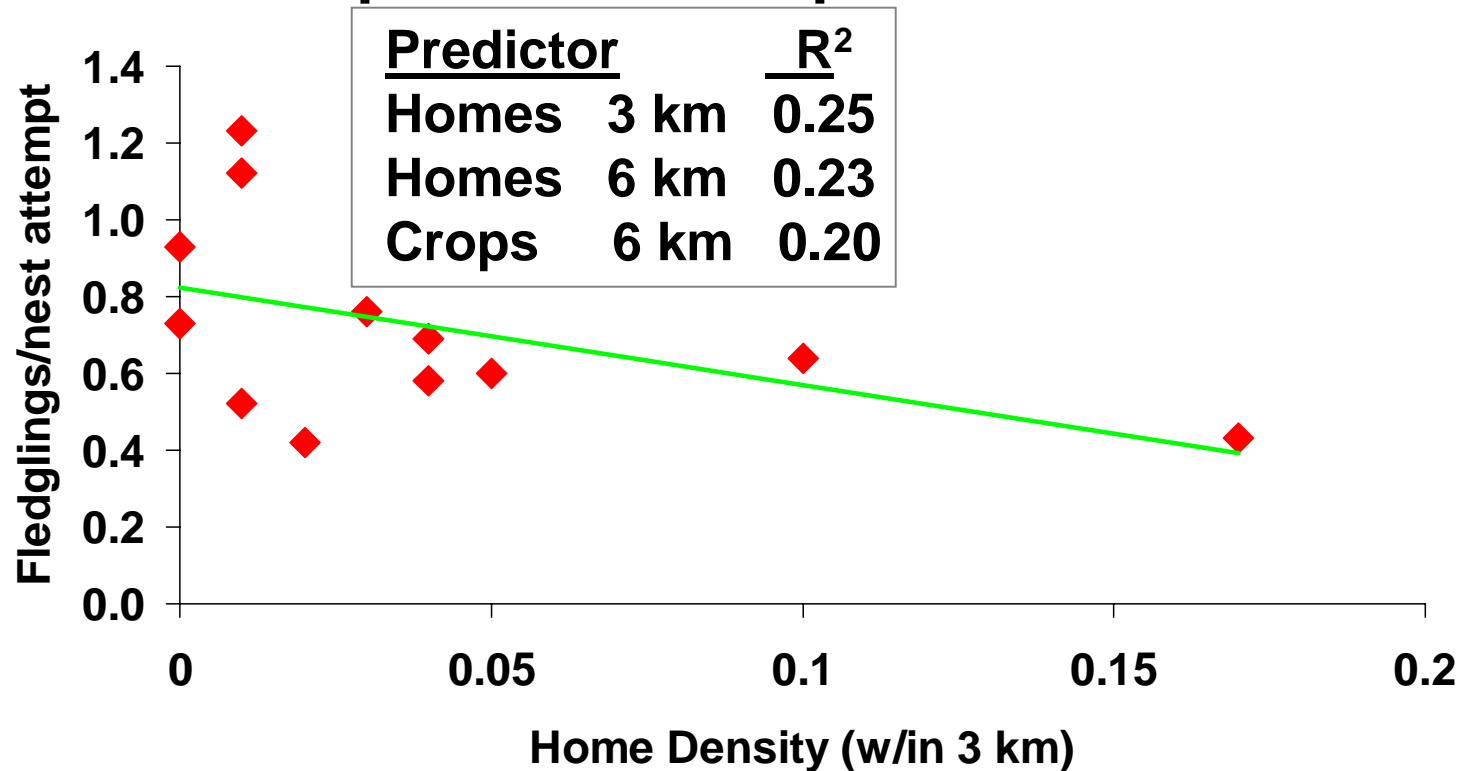
## Homes



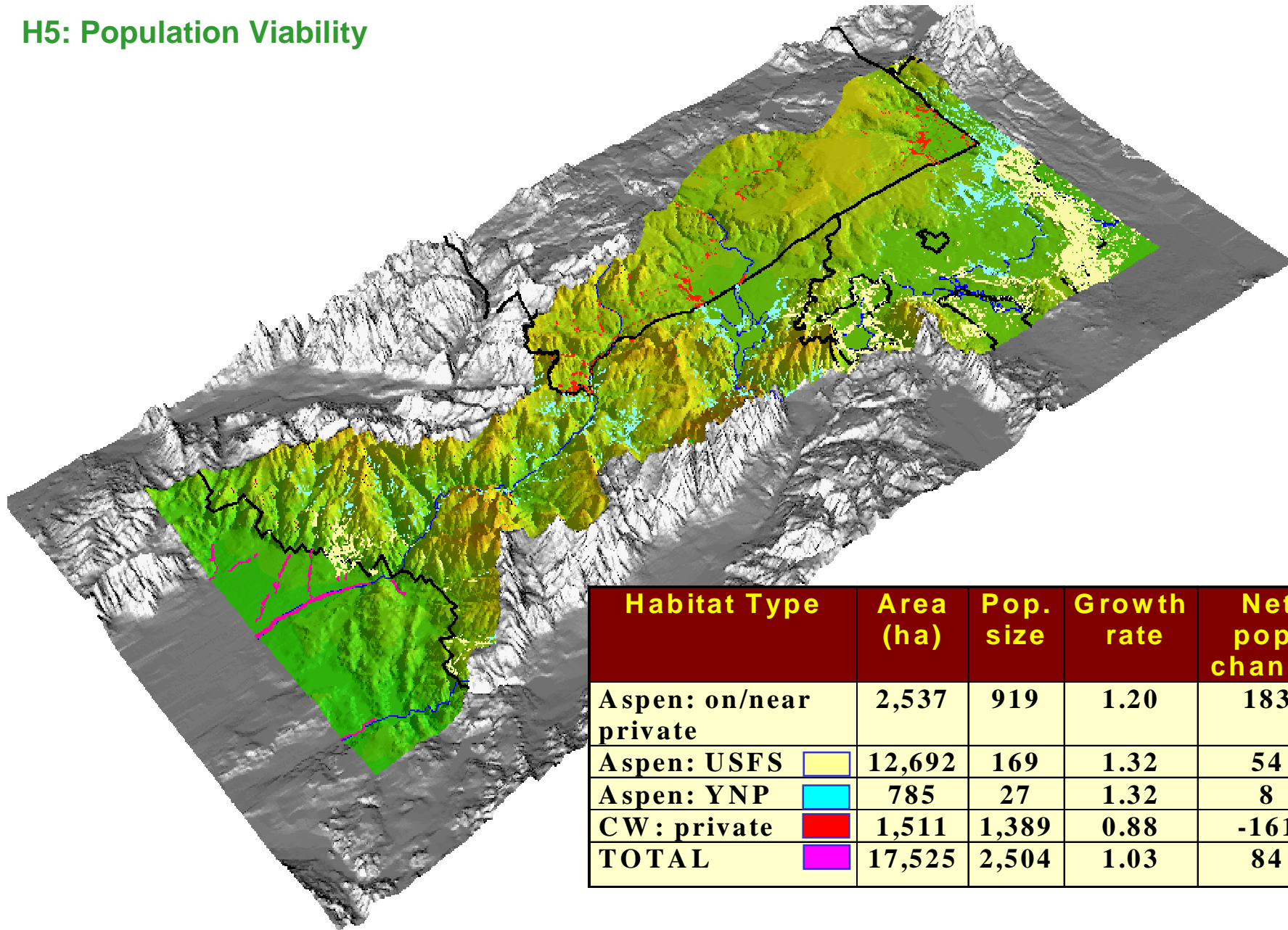
## Proximity Homes, Crops, Cattle

## Results: Land Use

### Reproductive Output



## H5: Population Viability



# Yellow Warbler Sources and Sinks

# Objective 3: Risk Assessment

## Approach

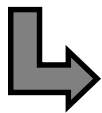
- **Develop a systematic approach for identifying which species are most at risk of extinction and what places in the landscape are required by these species.**
- **Apply the approach to the current GYE landscape as a basis for conservation.**
- **Develop and apply a system to predict future land use on private lands.**
- **Assess biodiversity risk under the simulated future landscape.**

### Obj 3: Risk Assessment

## DYNAMIC HABITAT AND POPULATION ANALYSIS

**DEFINE PLANNING  
AREA:**

Gap Analysis,  
Critical Ecosystems

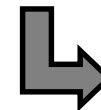


### **FILTER SPECIES AND PLACES**

Screen 1: Which  
species merit field  
study based on  
continental traits?

Screen 2: Which  
species and places  
merit demographic  
study based on local  
traits?

Screen 3: Which  
species and places are  
highest priority for  
conservation based on  
PVA?



### **MANAGE:**

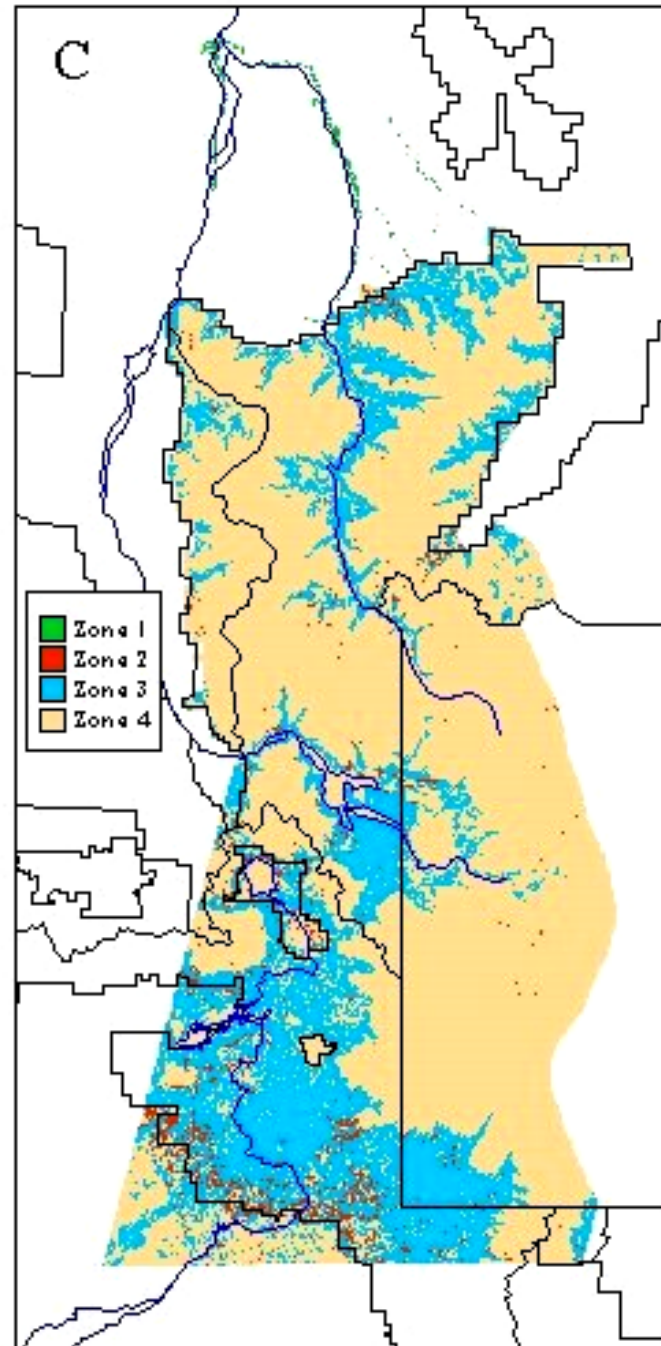
Design, Implement, Evaluate  
Management Strategies



## Examples of Species Deemed Most At Risk

- American redstart
- Willow flycatcher
- Veery
- Boblink
- Western woodpeewee
- Hammond's flycatcher
- Red-naped sapsucker
- Orange-crowned warbler
- Northern oriole
- Ruffed grouse
- Black-backed woodpecker

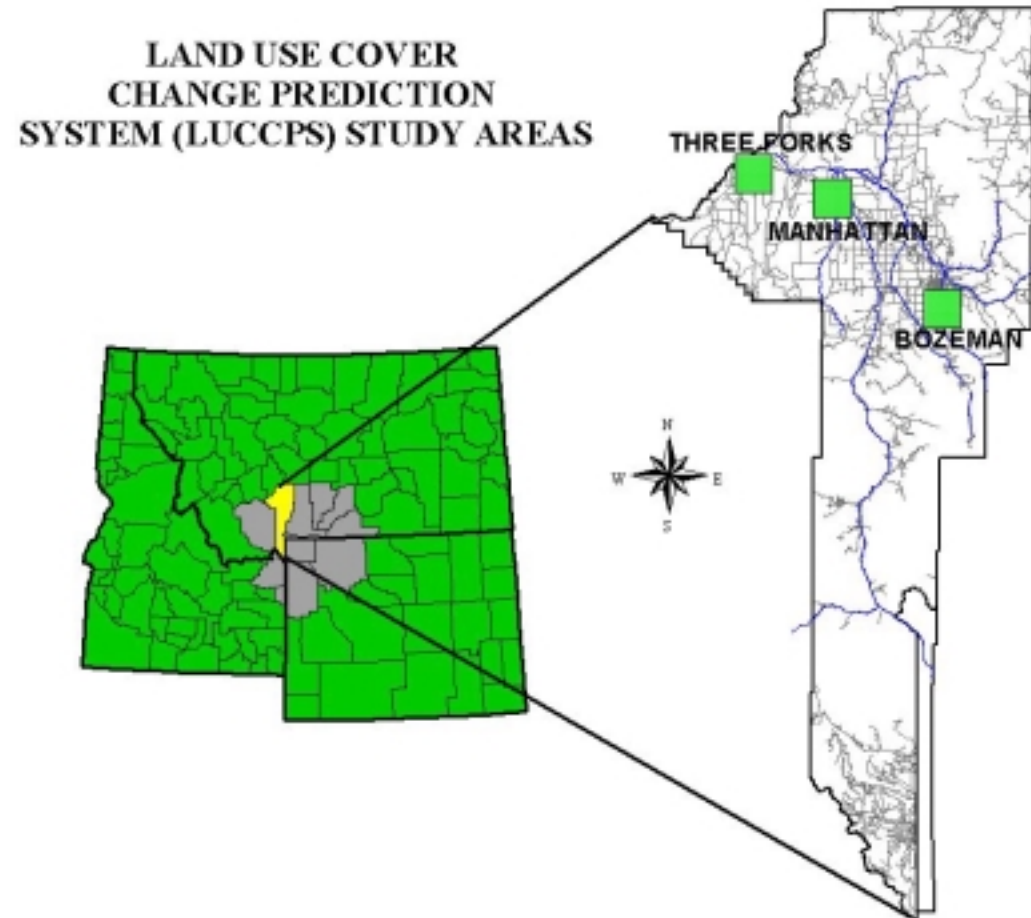
### Obj 3: Risk Assessment



## Example of Conservation Plan

Obj 3: Risk Assessment

# Land Use Cover Change Change Prediction System (LUCCPS)



### Obj 3: Risk Assessment

## Land Use Change Model

Select study sites that maximize land use change, e.g. adjacent to communities

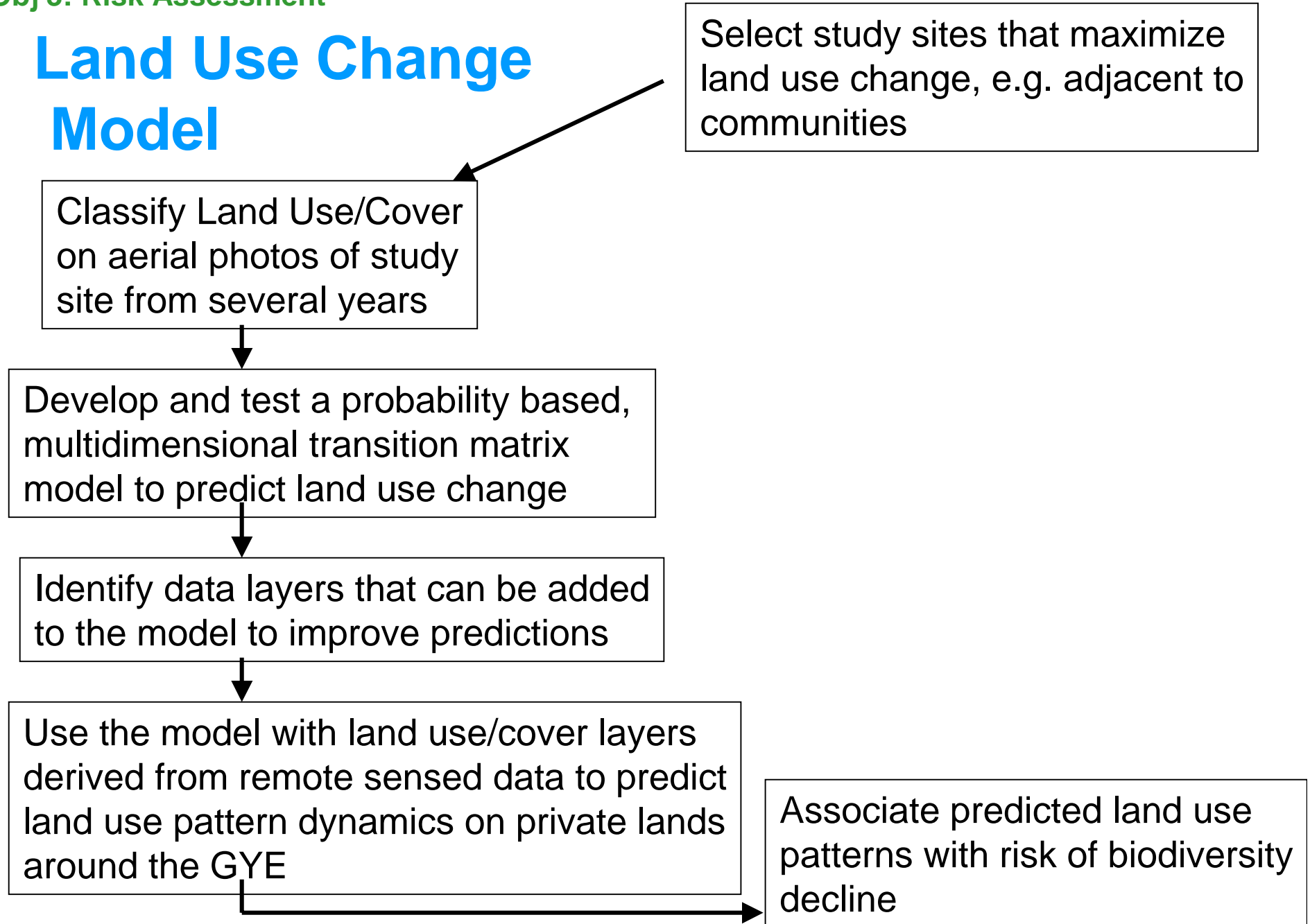
Classify Land Use/Cover on aerial photos of study site from several years

Develop and test a probability based, multidimensional transition matrix model to predict land use change

Identify data layers that can be added to the model to improve predictions

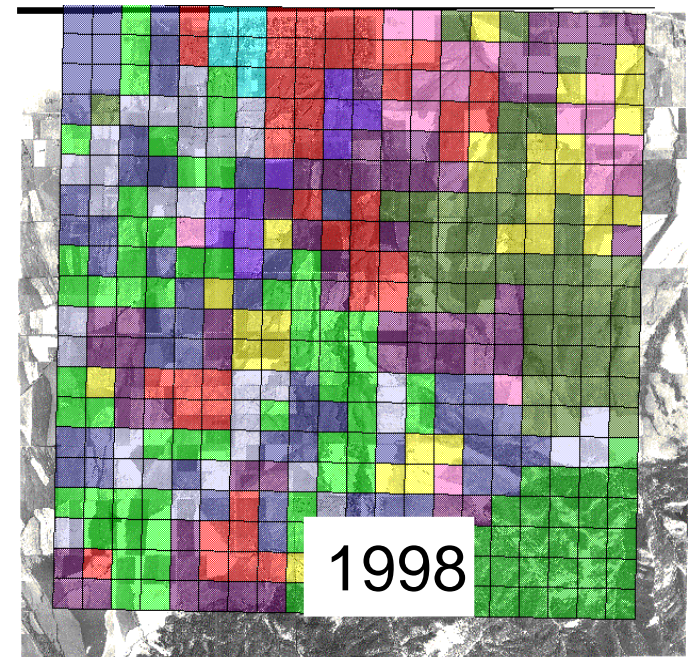
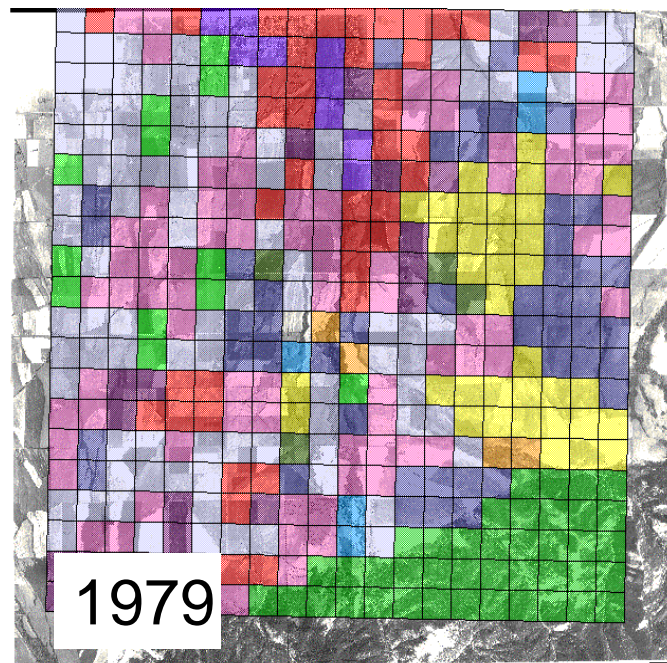
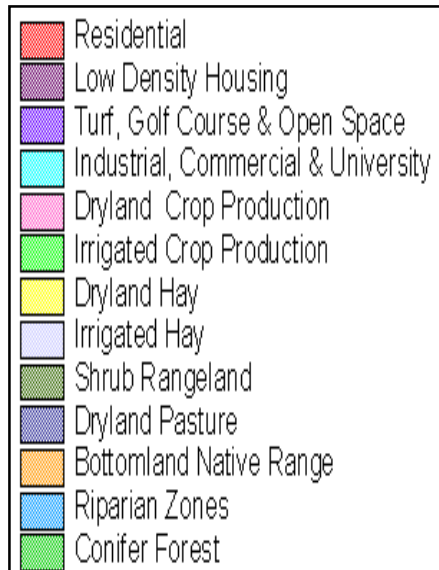
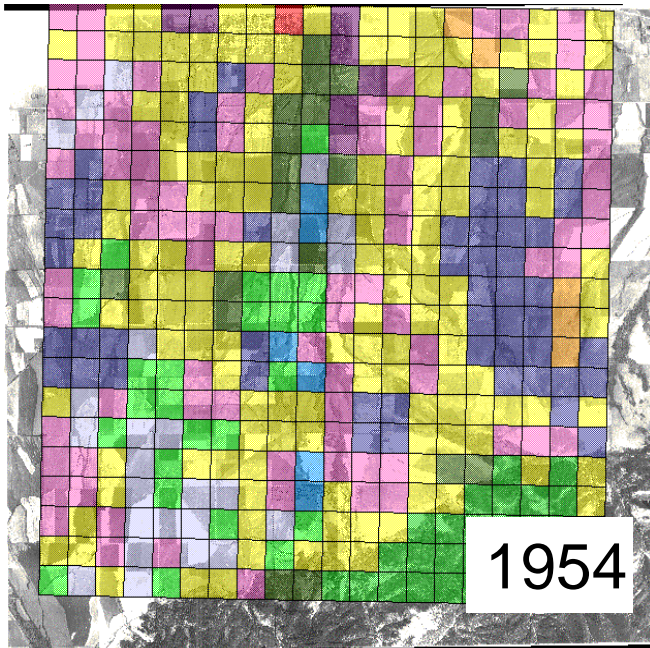
Use the model with land use/cover layers derived from remote sensed data to predict land use pattern dynamics on private lands around the GYE

Associate predicted land use patterns with risk of biodiversity decline





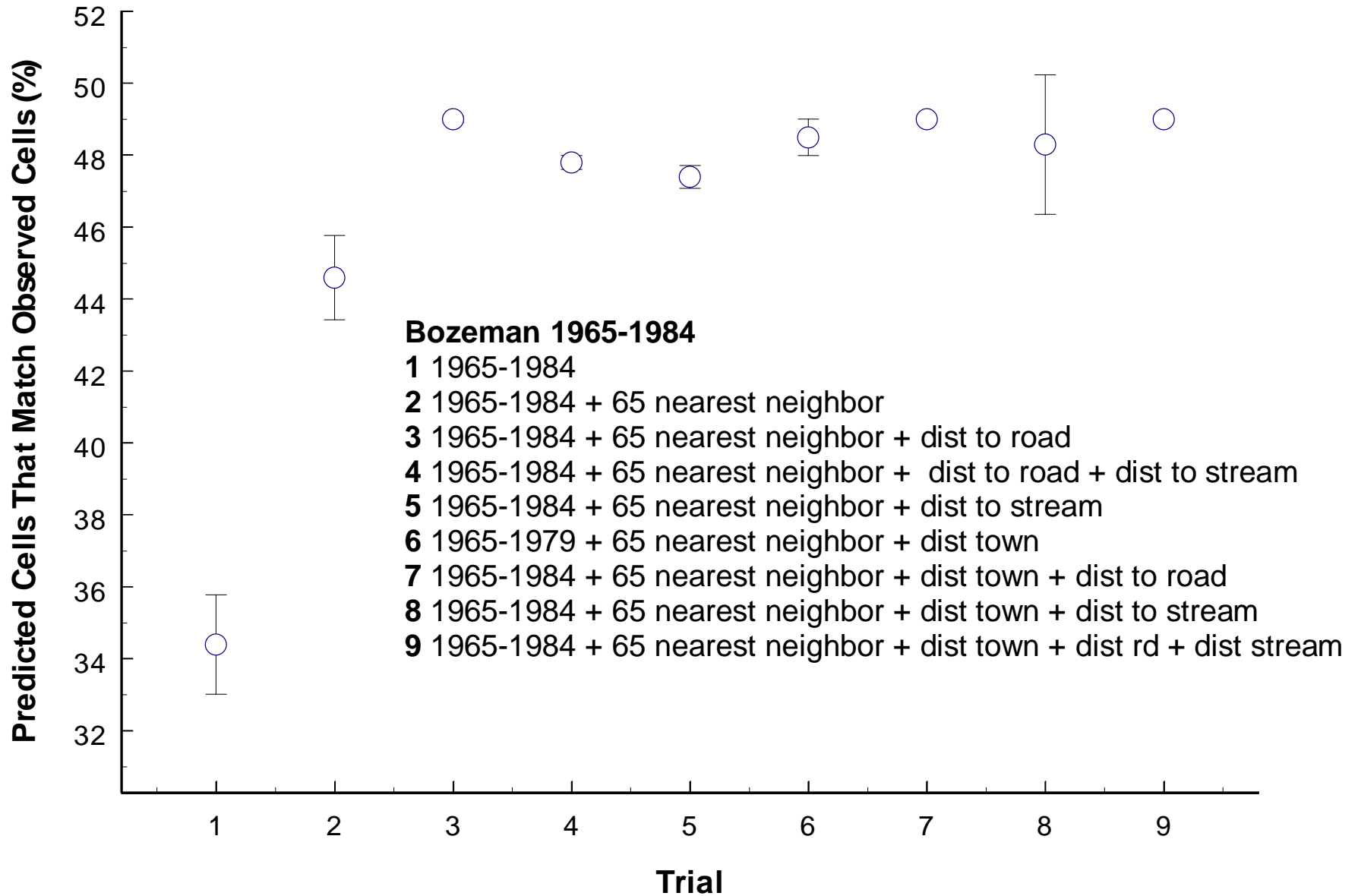
# Land Use Change : Bozeman, MT.



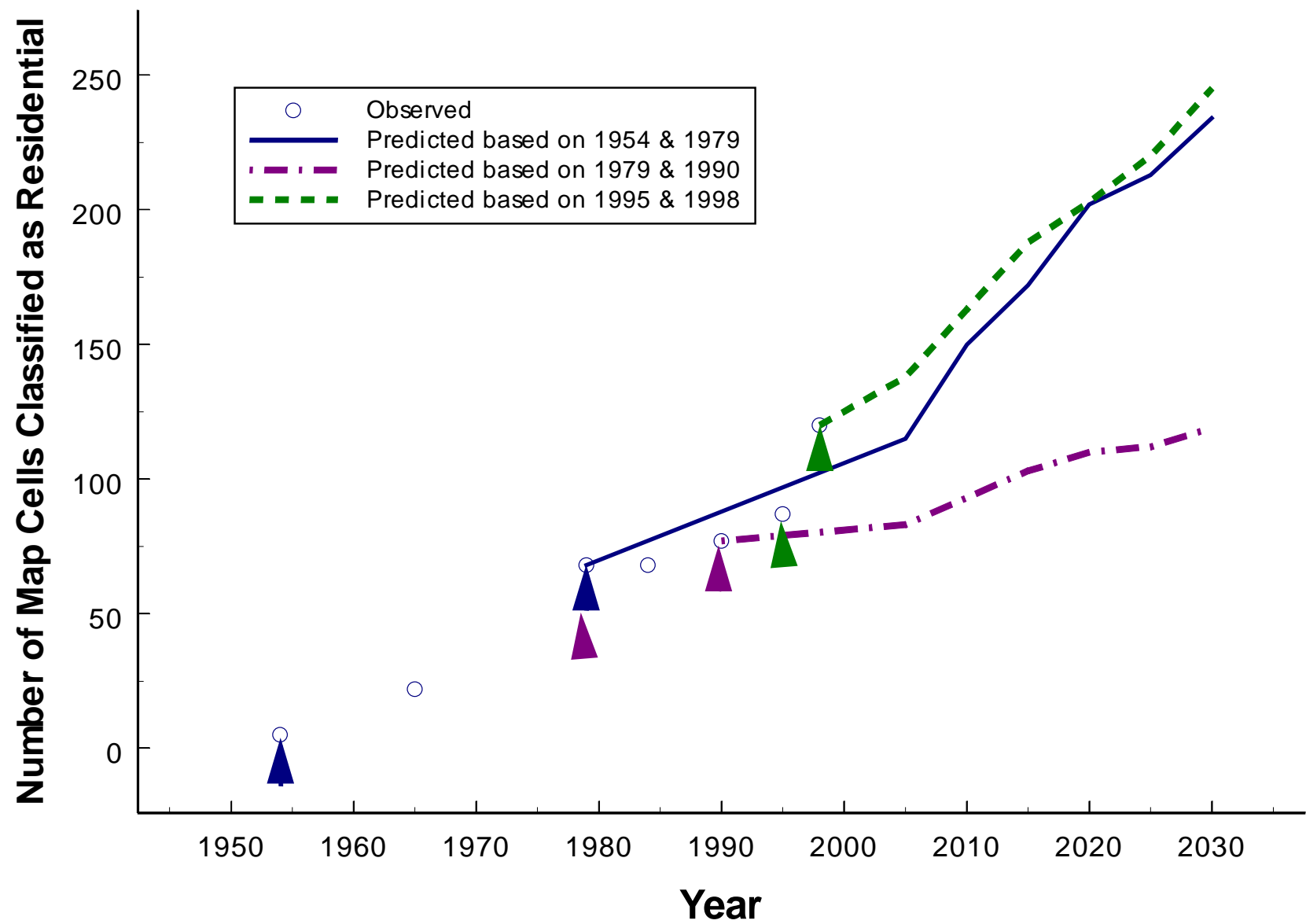


## Obj 3: Risk Assessment

# Modified Transition Probabilities



# Predictions of Residential



# Objective 4: Monitoring

## Approach

- Identify methods and data sources to “Take the pulse of the GYE” periodically.

## Objective 5: Outreach

- **Workshops: Bozeman, MT 1998, Jackson, WY 1999, Cody, WY 2000.**
- **Presentations: >15/yr to science, policy, management forums.**
- **Tools: land use model, risk assessment approach, socioeconomic workbook.**
- **Data: MSU:GYE Clearing house**
- **Media: Radio (Living on Earth, Morning Edition, High Country News Radio); Press (local newspapers and magazines).**

# SCHEDULE

1997

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1998

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1999

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2000

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Change 

Detection

Hypothesis 

Testing

Risk  
Assessment



Monitoring



Outreach

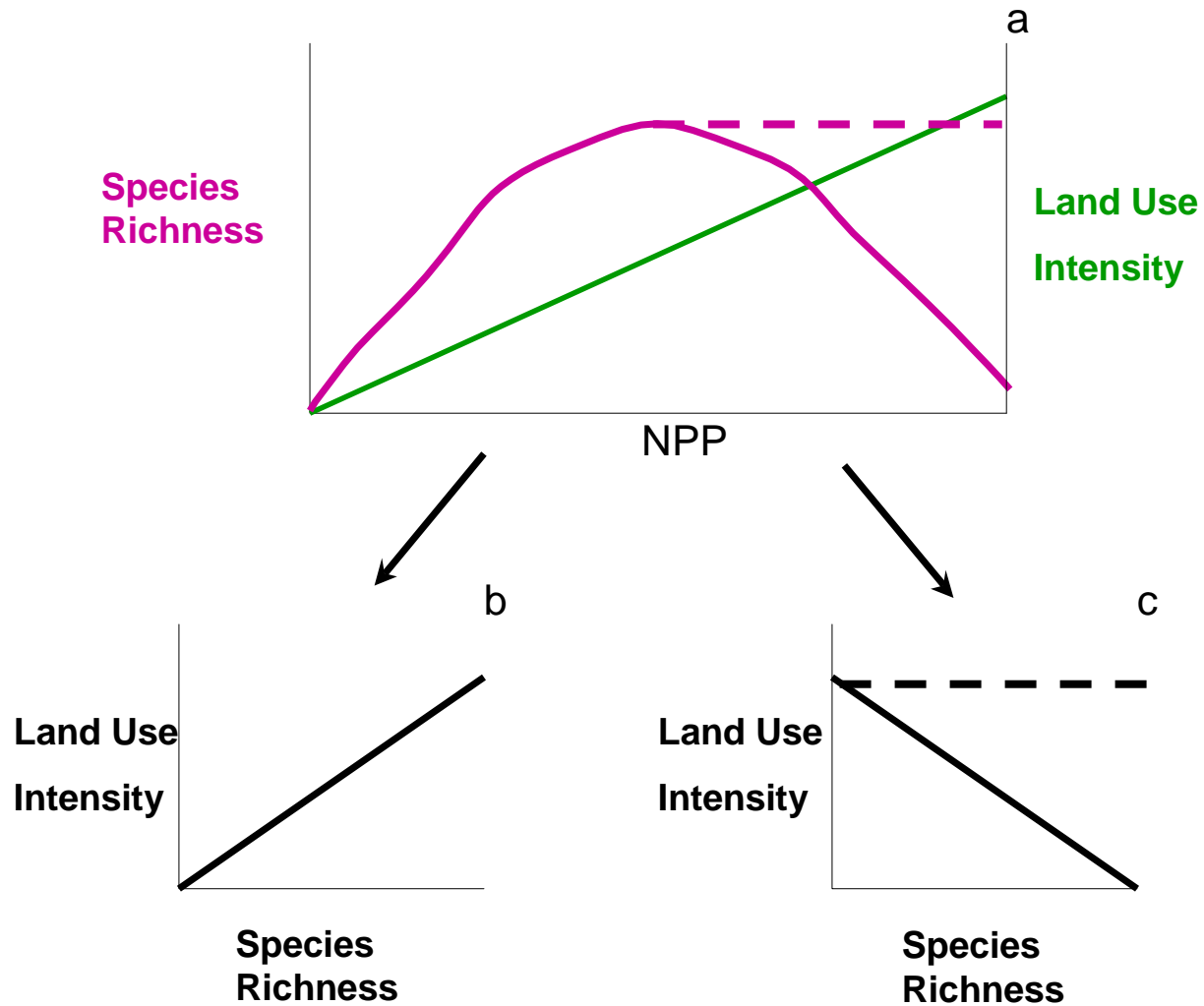




# Next Steps

- **GYE: Validation, Monitoring (e.g., Hansen and Rotella. IN Review. Indicators of biotic integrity and diversity in Greater Yellowstone: Development, validation, and application. EPA.**
- **GYE: Population Viability (e.g., Hansen and Rotella. In review Avian Population Viability in a Greater Ecosystem: Interactive Effects of Climate and Land Use. USDA-NRI.)**
- **Regional Comparision (e.g. Interactions among biodiversity and land use across greater ecosystems.**

# Generality to Other Greater Ecosystems



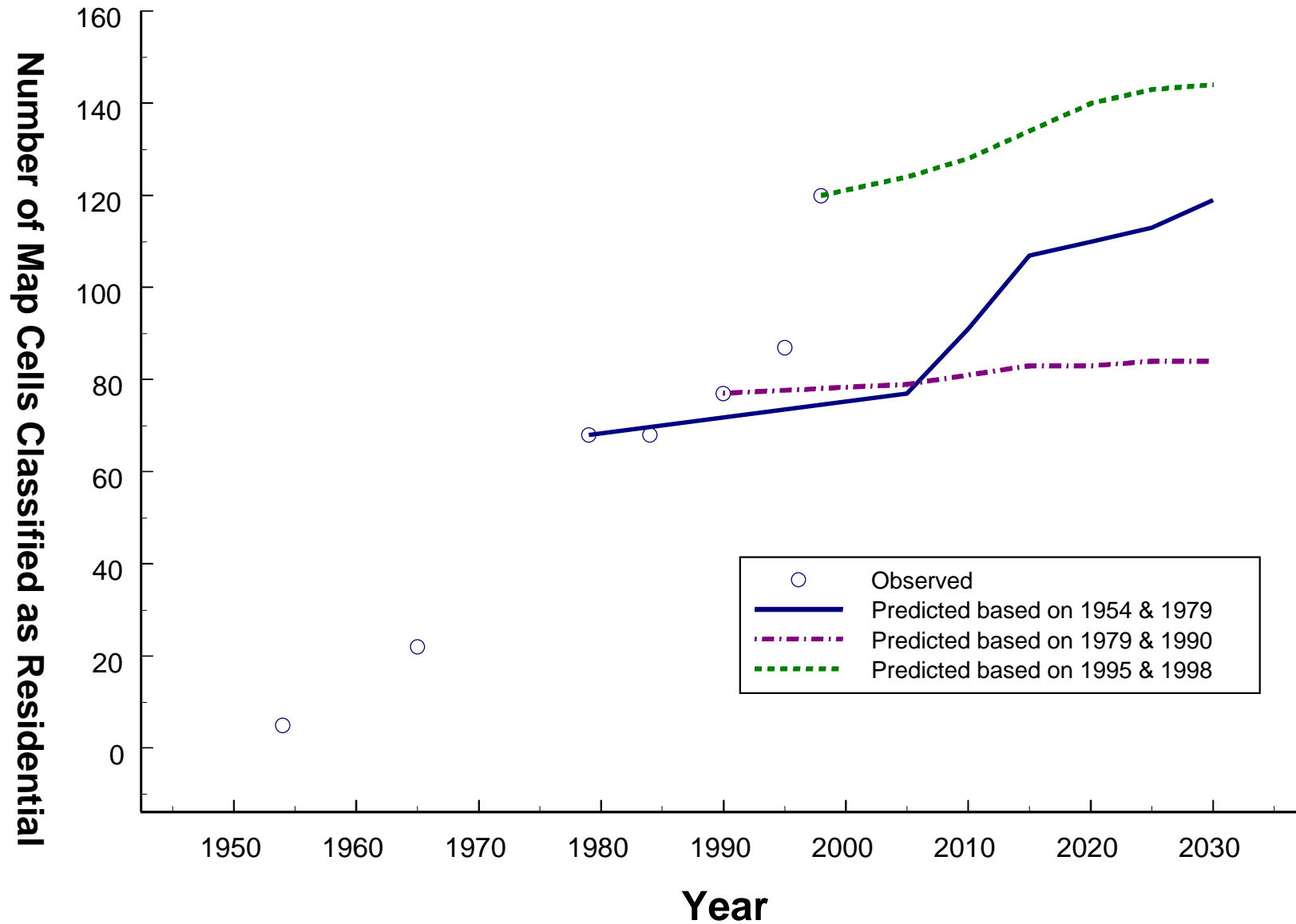
# Land Cover Classification Methods

## Change Detection

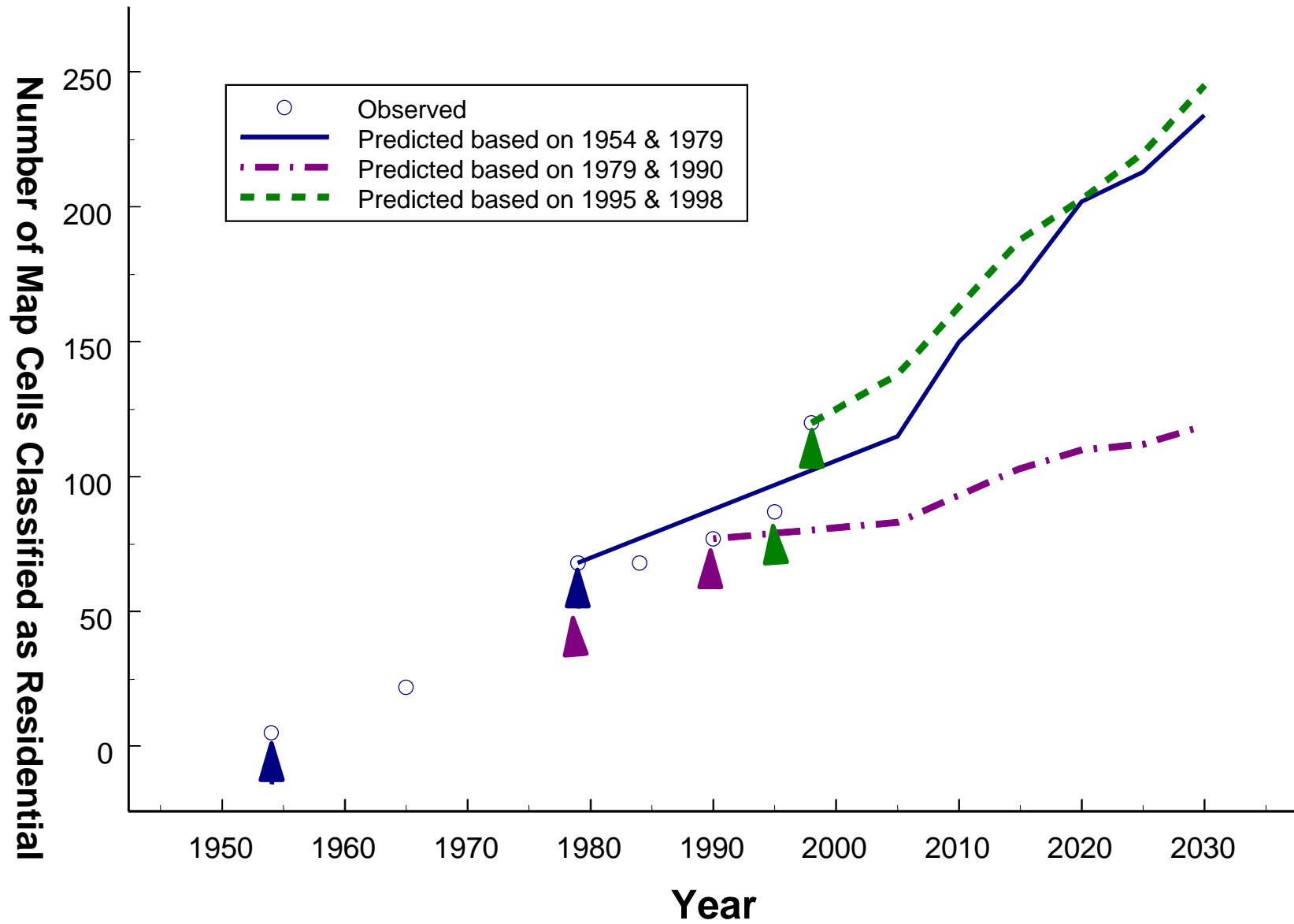
- **1. Obtain imagery:** 1976 Landsat MSS, 1985 Landsat MSS and TM, 1994 TM
- **2. Identify difference thresholds:** examine multispectral imagery and denote changes in cover type between 1985 and 1994
- **3. Determine change function:** identify type of previous cover type for areas that change
- **4. Assign cover type:** for each pixel in imagery. For cells unchanged, assign 1994 cover type.
- **5. Validate for accuracy:** use independent data

# South of Bozeman Study Area

*using nearest neighbor layer*

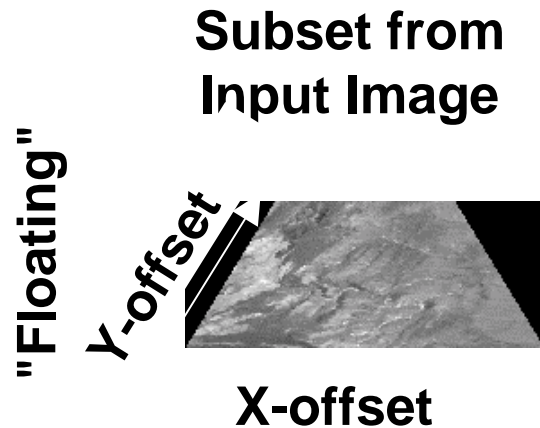


# South of Bozeman Study Area



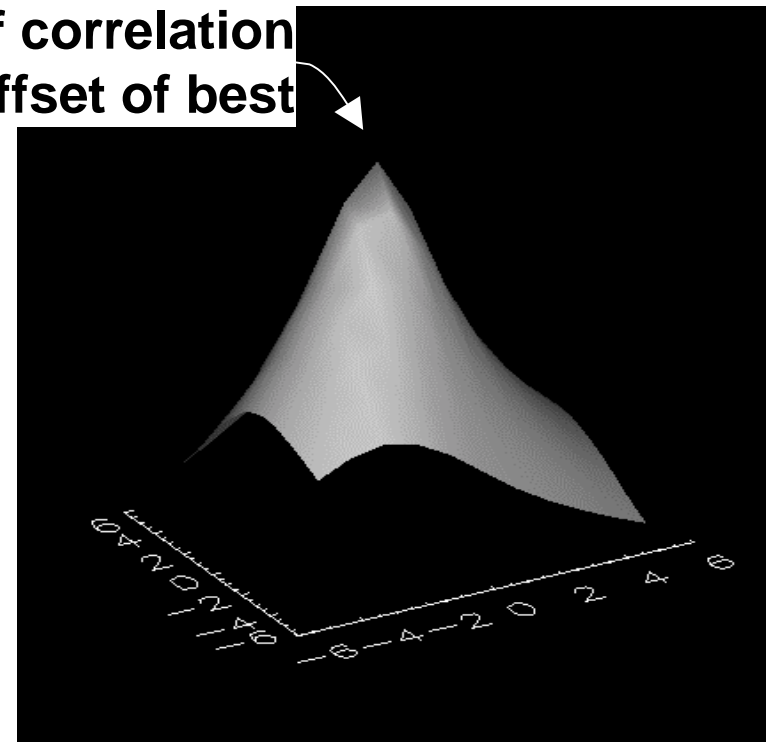


## Correlation-based designation of single ground control point



Offset used to calculate  
coordinates of GCP

Peak of correlation  
at offset of best



Calculate correlation at each  
offset

